



Vitamin D, Folate, and Cobalamin Serum Concentrations Are Related to Brain Volume and White Matter Integrity in Urban Adults

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Background and objectives: Lower vitamin status has been linked to cognitive deficits, pending mechanistic elucidation. Serum 25-hydroxyvitamin D [25(OH)D], folate and cobalamin were explored against brain volumes and white matter integrity (WMI).

Methods: Three prospective waves from Healthy Aging in Neighborhoods of Diversity Across the Life Span (HANDLS) study were used [Baltimore, City, MD, 2004–2015, $N = 183$ –240 urban adults (Age_{v1} : 30–64 years)]. Serum vitamin 25-hydroxyvitamin D [25(OH)D], folate and cobalamin concentrations were measured at visits 1 (v_1 : 2004–2009) and 2 (v_2 : 2009–2013), while structural and diffusion Magnetic Resonance Imaging (sMRI/dMRI) outcomes were measured at v_{scan} : 2011–2015. Top 10 ranked adjusted associations were corrected for multiple testing using familywise Bonferroni (FWER < 0.05) and false discovery rates (FDR, q -value < 0.10).

Results: We found statistically significant (FWER < 0.05; $\beta \pm \text{SE}$) direct associations of 25(OH)D(v_1) with WM volumes [overall: $+910 \pm 336$ /males: $+2,054 \pm 599$], occipital WM; [overall: $+140 \pm 40$, males: $+261 \pm 67$ and $\text{Age}_{v1} > 50$ years: $+205 \pm 54$]; parietal WM; [overall: $+251 \pm 77$, males: $+486 \pm 129$ and $\text{Age}_{v1} > 50$ years: $+393 \pm 108$] and left occipital pole volume [overall: $+15.70 \pm 3.83$ and above poverty: 19.0 ± 4.3], findings replicated for 25(OH)D (v_2 – v_1) annualized exposure, which was also linked with greater WMI (fractional anisotropy, FA) in the anterior limb of the internal capsule (ALIC); FWER < 0.05 [Overall: $+0.0020 \pm 0.0004$; Whites: $+0.0024 \pm 0.0004$] and in the cingulum (hippocampus) [Overall: $+0.0016 \pm 0.0004$]. Only trends were detected for cobalamin exposures ($q < 0.10$), while serum folate (v_1) was associated with lower mean diffusivity (MD) in ALIC, reflecting greater WMI, overall.

Conclusions: Among urban adults, serum 25(OH)D status and increase were consistently linked to larger occipital and parietal WM volumes and greater region-specific WMI. Pending longitudinal replication of our findings, randomized controlled trials of vitamin D supplementation should be conducted against brain marker outcomes.

Keywords: 25-hydroxyvitamin D, folate, cobalamin, brain volumes, white matter integrity, cognitive aging, health disparities

INTRODUCTION

A possible beneficial effect of several vitamins on cognition has been suggested (Beydoun et al., 2014a). Vitamin D is a steroid hormone that regulates calcium homeostasis. Serum 25-hydroxyvitamin D [25(OH)D], or vitamin D status, is primarily determined by sunlight skin exposure and secondarily by dietary and supplemental intakes (Buell and Dawson-Hughes, 2008). Vitamin D's active form (1,25-dihydroxyvitamin D₃) maintains and stabilizes intracellular signaling pathways involved in memory and cognition (Eyles et al., 2013) by increasing VDR (Guo et al., 2016) and *LRP2* expression in the choroid plexus and helping clear neurotoxic β -amyloids (Deane et al., 2004; Carro et al., 2005) involved in Alzheimer's disease (AD) pathogenesis (Roher et al., 1993). Vitamin D-related gene polymorphisms and lower vitamin D intake and status were linked to cognitive decline in epidemiological studies (Annweiler et al., 2016; Kuzma et al., 2016; Beydoun et al., 2018; Goodwill et al., 2018) and to markers of brain atrophy and poor white matter integrity (WMI) (Buell et al., 2010; Annweiler et al., 2013, 2015b; Michos et al., 2014; Prager et al., 2014; Brouwer-Brolsma et al., 2015; Del Brutto et al., 2015; Moon et al., 2015; Karakis et al., 2016; Littlejohns et al., 2016; Al-Amin et al., 2019). Vitamin D's neuroprotective role is likely mediated through the expression of neurotrophins, neurotransmitters, and suppression of inflammatory cytokines (Buell and Dawson-Hughes, 2008; Miller, 2010; Etgen et al., 2012).

Moreover, folate and cobalamin (vitamin B-12) are essential in remethylation of homocysteine (Hcy), a sulfur amino acid with neurotoxic and excitotoxic properties (Kruman et al., 2000), yielding methionine (Bottiglieri, 2005; Troesch et al., 2016). Hcy was recently shown in animal studies to increase tau protein phosphorylation, truncation, and oligomerization, an evidence of direct involvement in AD's second pathological hallmark, namely

neurofibrillary tangles (NFTs) (Shirafuji et al., 2018). Hcy is also converted to cysteine via a vitamin B6-dependent mechanism (Troesch et al., 2016). Importantly, folate and cobalamin status were inversely associated with age-related cognitive decline (McCaddon and Miller, 2015; Smith and Refsum, 2016), with cobalamin further exhibiting direct associations with brain volumes and WMI (Erickson et al., 2008; Vogiatzoglou et al., 2008; De Lau et al., 2009; Pieters et al., 2009; Lee et al., 2016). A recent trial demonstrated beneficial effects of B-vitamin supplementation on brain magnetic resonance imaging (MRI) measures and cognitive function longitudinally (De Jager et al., 2012; Douaud et al., 2013). Furthermore, nutritional biomarkers may work synergistically to improve cognitive outcomes (Min and Min, 2016; Moretti et al., 2017). Since socio-demographic factors relate to both nutrition and cognition (Beydoun et al., 2014b; Berg et al., 2015; McCarrey et al., 2016; Weuve et al., 2018), studying relations of vitamin D, folate and cobalamin with brain MRI measures, while stratifying by relevant sociodemographic factors is key.

This study examines associations of serum 25(OH)D, folate and cobalamin concentrations with brain volume and WMI among a diverse sample of urban adults, while stratifying by sex, age, race, and poverty status. We hypothesized that first-visit serum 25(OH)D, folate, and cobalamin (and annual rate of change over time) would directly correlate with global and regional gray and white matter (WM and GM) brain volumes and regional WMI measured at one follow-up visit (v_{scan}), after a mean follow-up of 5.7 years. Analyses also explored brain regions' sensitivity to lower vitamin status, differentially by socio-demographic factors.

METHODS AND MATERIALS

Database

Using area probability sampling, a socio-demographically diverse sample of middle-aged White and African-American urban adults (Age v_1 : 30–64 years) from thirteen contiguous census tracts of Baltimore was recruited into the Healthy Aging of Neighborhoods of Diversity across the Life Span (HANDLS) study (Evans et al., 2010). HANDLS is an on-going prospective cohort study, initiated in 2004 by the National Institute on Aging. Potential participants were interviewed and identified by random selections of address listings within each census tract (Evans et al., 2010). Participants were invited to join HANDLS if they met the following criteria: (1) between ages 30–64; (2) not currently pregnant; (3) not within 6 months of active cancer treatment; (4) not diagnosed with AIDS; (5) capable of providing written

Abbreviations: AA, African Americans; ALIC, Anterior Limb of the Internal Capsule; C-TRIM, Core for Translational Research in Imaging @ Maryland; DTI, Diffusion Tensor Imaging; dMRI, Diffusion MRI; FA, Fractional Anisotropy; FWER, Familywise Error Rate; FDR, False Discovery Rate; FLAIR, Fluid-Attenuated Inversion Recovery; FOV, Field of View; GM, Gray Matter; HANDLS, Healthy Aging in Neighborhoods of Diversity across the Life Span study; HS, High School; LRP2, Megalin gene; MP-RAGE, Magnetization prepared rapid gradient echo; MRI, Magnetic Resonance Imaging; MD, Mean Diffusivity; MRV, Medical Research Vehicle; MMSE, Mini-Mental State Examination; MICO, Multiplicative intrinsic component optimization; MUSE, Multi-atlas region Segmentation utilizing Ensembles; OCM, One-Carbon Metabolism; ROI, Regions of Interest; 25(OH)D, Serum 25-hydroxyvitamin D; FOL, Serum folate; B-12, Serum vitamin B-12; Hcy, Homocysteine; SA, Sensitivity Analysis; sMRI, Structural MRI; TR, TRACE; US, United States; VDR, Vitamin D receptor gene; WMI, White Matter Integrity; WM, White Matter.

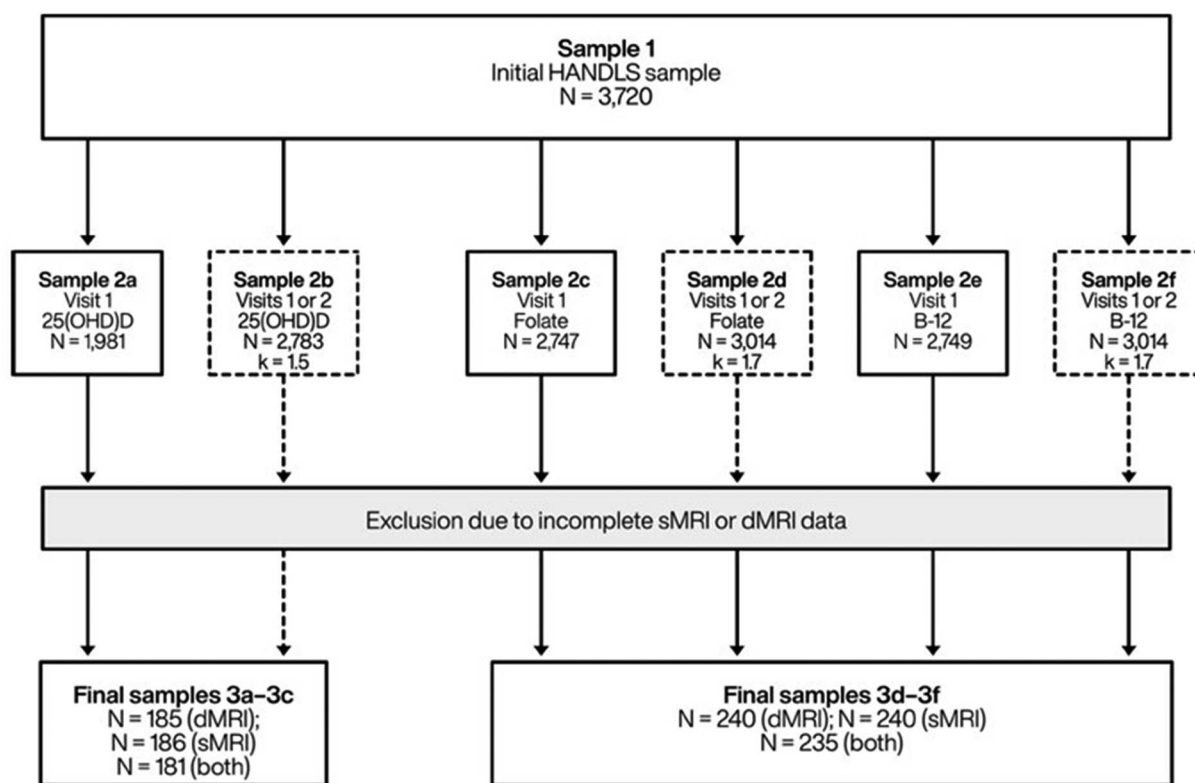


FIGURE 1 | Study participant schematic: HANDLS 2004–2013 and HANDLS-SCAN 2011–2015^a. 25(OH)D, 25-hydroxyvitamin D; B-12, Vitamin B-12 (cobalamin); dMRI, Diffusion magnetic resonance imaging; HANDLS, Healthy Aging in Neighborhoods of Diversity Across the Life Span; k, average number of repeats; sMRI, Structural/volumetric magnetic resonance imaging. ^aVisit 1 refers to HANDLS 2004–2009; Visit 2 refers to HANDLS 2009–2013; and HANDLS-SCAN visit (v_{scan}) was carried out between 2011 and 2015.

informed consent, thus excluding individuals with probable dementia or very low literacy among others; (6) with a valid government-issued identification and a verifiable address (Evans et al., 2010).

Initial examinations were performed in two phases. Phase 1 included the first dietary interview and completion of various demographic and psychosocial scales. Phase 2, performed on Medical Research Vehicles (MRV) parked in participants' neighborhoods, included the second dietary interview and various physical, medical, and psychosocial examinations, including DXA for bone mineral density and body composition, EKG, intima-media thickness by ultrasound, personal and family health history, physical examination by a physician, physical performance by a brief screening battery, neuropsychological tests, and inventories to assess depressive symptoms (Evans et al., 2010). Follow-up visits included largely comparable MRV visits. At visit 2 (v_2 , 2009–2013), blood draw analyzed in the same laboratory facility as for visit 1 yielded similar biochemical and hematological indices that can be studied longitudinally.

Written informed consent was obtained from all participants. Study protocols for HANDLS and HANDLS SCAN were approved by the National Institute on Environmental Health Sciences Institutional Review Board (IRB) of the National

Institutes of Health. HANDLS SCAN was also approved by the IRBs of the University of Maryland School of Medicine and the University of Maryland, Baltimore County.

This study analyzed nutritional biomarker data from visit 1 (v_1 : 2004–2009) [as well as change between v_1 and v_2 (2009–2013)] in relation to follow-up data measured in a sub-sample of $N_{max} = 258$ participants within the HANDLS SCAN sub-study (v_{scan} : 2011–2015) (Waldstein et al., 2017). Exposure variables were measured during the Medical Research Vehicle (MRV) examinations (v_1 and/or v_2); outcomes were MRI measures of brain volume and WMI at v_{scan} (Waldstein et al., 2017). The mean follow-up time between visit 1 and v_{scan} was 5.70 years \pm 1.90.

Study Sample

The initial HANDLS cohort included 3,720 participants (30–65 years, AAs and Whites, Phase I, visit 1). We included participants with complete and valid MRI data at follow-up and complete 25(OH)D, folate and cobalamin data at visit 1 and/or visit 2 (Figure 1). Mean \pm SD of follow-up time between v_1 and v_2 was 4.65 years \pm 0.93 (range: 0.4–8.2 years). The final sample was reduced to $N = 185$ –186 for vitamin D and $N = 240$ for folate or cobalamin exposures.

Brain sMRI

A Siemens Tim-Trio 3.0 Tesla scanner was used for MRI assessments. Magnetization prepared rapid gradient echo (MP-RAGE) was used to perform volumetric measurements for anatomical regions. Volumetric measures were estimated for each region of interest (ROI). Detailed description is provided in **Supplemental Method 1**.

In addition to standard axial T1, T2, FLAIR images, a high-resolution axial T1-weighted MP-RAGE (TE = 2.32 ms, TR = 1900 ms, TI = 900 ms, flip angle = 9°, resolution = 256 × 256 × 96, FOV = 230 mm, sl. Thick. = 0.9 mm) of the brain was acquired for structural imaging. Images were used as anatomic references and to extract parameters of regional and whole brain volumes (see **Supplemental Table 1**). This study comprehensively examines brain volumes at ascending segmentation levels.

Brain dMRI

dMRI was obtained using multi-band spin echo EPI sequence with a multi-band acceleration factor of three (**Supplemental Method 1**). Fractional Anisotropy (FA) and trace (TR, aka mean diffusivity or MD) images were computed from tensor images. As intact WM generally allows for more restricted diffusion, higher FA values are indicative of healthier WMI. Summing eigenvalues for diffusion tensor yields MD, with higher values indicative of poorer WMI (Jones, 2008). Computed FA and MD images were aligned to a common template space via deformable registration using a standard dMRI template (i.e., EVE Wakana et al., 2004). Right and left FA and MD values were averaged for each ROI (see **Supplemental Table 2** for list of ROIs).

Vitamin Status Measures

Participants were asked to fast for ≥8 h prior to the MRV visits, and specimens in volumes of 2 mL serum were collected and frozen at −80°C. Similar procedures were adopted for v_1 and v_2 serum folate and cobalamin, measured using chemiluminescence immunoassay¹ by Quest Diagnostics, Chantilly, VA², and previously validated against other automated methods with coefficient of variation (CV) < 10% (Owen and Roberts, 2003; Ispir et al., 2015).

25(OH)D were measured using slightly different methodologies between v_1 and v_2 . For both visits, blood samples drawn at examination were stored at −80°C. At v_1 , total levels of serum 25(OH)D (in ng/mL; D₂ and D₃) were measured using tandem mass spectrometry (interassay CV, 8.6%) at Massachusetts General Hospital, <60 days later, as recommended for frozen samples (Powe et al., 2013). v_2 25(OH)D was measured by Quest Diagnostics (Chantilly, VA) using an immunoassay that includes competitive binding of serum 25(OH)D and tracer-labeled 25(OH)D to specific antibody followed by detection and quantitation via chemiluminescence

reaction (Diasorin, formerly Incstar), comparable to National Health and Nutrition Examination Surveys 2003–04 assays³ (interassay CV: 4–13%) (Centers for Disease Control Prevention, 2006; Diagnostics, 2019)⁴.

Dietary and supplemental intakes of vitamin D, folate and cobalamin were shown to moderately correlate with their corresponding serum biomarkers in HANDLS and national surveys (Beydoun et al., 2010a,b, 2018). Moreover, moderate-to-strong correlations were detected for all three biomarkers (Pearson's $r > 0.30$) with annual rates of change also correlating positively with visit 1 values (**Supplemental Method 2**), as did v_1 vs. v_2 values for each vitamin in the HANDLS sample: 25(OH)D ($r = 0.44$, $n = 1,462$); folate ($r = 0.44$, $n = 1,944$); cobalamin ($r = 0.55$, $n = 1,994$). We also describe categorical exposures with cutoffs reflecting vitamin insufficiency or deficiency (Snow, 1999; Thacher and Clarke, 2011; World Health Organization, 2015).

Covariates

All models were adjusted for baseline examination age (y), sex (male = 1, female = 0), race (AA = 1, White = 0), self-reported household income either <125% or ≥125% of the 2004 Health and Human Services poverty guidelines (termed poverty status) (US Department of Health & Human Services, 2019), and time (days) between baseline MRV visit and MRI scan visit. Models were independently stratified by age (≤50 vs. >50 years), sex, race, or poverty status. Additional covariates were entered in a sensitivity analysis when independently associated with each exposure of interest (see **Supplemental Method 3**).

Statistical Analysis

Analyses were conducted using Stata version 16.0 (Stata, 2019). First, selected sample characteristics were described, and their means and proportions across key socio-demographic groups were calculated. *T*-test, chi-square, multiple linear, and logistic regression models (Wald tests) were used to determine group differences in distributions of continuous and categorical variables. Second, several sets of analyses were conducted to test main hypotheses, both overall and stratified by age group (≤50 vs. >50 years), sex, race, or poverty status. Ordinary least square regression models included each v_1 vitamin exposure predicting each MRI measure as the outcome measured at v_{scan} , while adjusting for socio-demographic confounders. Ultimately, the most significant adjusted associations with the lowest *p*-values [or highest −Log₁₀(*p*)] per analysis were selected, along with their unstandardized ($\beta \pm SE$) and standardized (*b*) effect sizes. Consequently, a looping procedure (*parmsby* command) was applied to generate main parameter estimates, interpreted as change in MRI measure per unit change in serum vitamin biomarker for β and fraction of a SD change in MRI measure per 1 SD change in that biomarker for *b*, which was moderate-to-strong if >0.20, and weak-to-moderate if between 0.10 and 0.20.

¹Siemens Centaur. Available online at: <https://www.siemens-healthineers.com/en-us/immunoassay/systems>

²Diagnostics, Q. Vitamin B-12 (Cobalamin) and Folate Panel. Available online at: <https://testdirectory.questdiagnostics.com/test/test-detail/7065/vitamin-b12-cobalamin-and-folate-panel-serum?cc=MASTER> (accessed October 21, 2019).

³NHANES 2003–2004. Available online at: https://www.cdc.gov/nchs/data/nhanes/nhanes_03_04/106vid_c_met_Vitamin_D.pdf (accessed December 16, 2019).

⁴Diasorin. Available online at: https://diasoringroup.com/en?gclid=EAIaIQobChMI3JLjuq265gIVhIvICh3G-QcTEAAYASAAEgLz-fD_BwE (accessed December 16, 2019).

Four separate analyses were conducted based on MRI variable groupings. The first analysis included total brain volume (i.e., WM + GM), WM and GM volumes as the only 3 exposure measures (**Model A**). The second analysis included 8 measures (**Model B**): the combination of WM and GM of the 4 main cortical regions: frontal, temporal, parietal, and occipital lobes. A third analysis included the smaller regions, accounting for bilateral volumes, yielding 142 outcome measures (**Model C**). Finally, dMRI measures were included, after taking the average between the left and right side for FA and MD measures, as done previously (McKay et al., 2019). This exploratory approach was conducted previously by at least one other study of vitamin D deficiency and WMI (Moon et al., 2015). This resulted in 98 (49 FA and 49 MD) dMRI outcome measures, reflecting WMI (**Model D**).

For uncorrected p -values, Type I error < 0.05 was used for significance. To adjust for multiple testing two methods were used: (1) Familywise Bonferroni (error rate) correction (FWER) which adjusted for multiplicity in brain MRI measures, assuming each set of modeling approach (Models A-D and stratification status) applied to each serum vitamin [25(OH)D, folate and cobalamin] to be separate hypotheses, (2) false discovery rate (q -value) which only considered the four approaches/stratification status as separate hypotheses (i.e., Models A-D, and stratification status), thus combining the 3 vitamin exposures upon correction. Moreover, the top 10 adjusted associations from each analysis were presented if $p_{\text{uncorr}} < 0.05$, showing the main parameter estimate and its standard error (SE), the uncorrected p -values, the FDR q -values and FWER status (Yes = passed correction, No = did not pass) and the standardized effect size b . Top 10 associations were considered statistically significant if passing FWER correction for a specific vitamin, model and stratification status (yes vs. no) at type I error of 0.05. Results with FDR q -value < 0.10 per model and stratification status while failing the FWER criterion were considered a trend. Additionally, when passing FDR q -value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, an effect was considered a trend if $|b| \geq 0.20$. Among selected stratified models (top 10 findings), formal effect modification testing was conducted by including 2-way interaction terms between exposure and each socio-demographic factor in the non-stratified model. A Type I error of 0.10 was used for 2-way interaction terms due to reduced statistical power (Selvin, 2004). In addition, the main analyses with v_1 exposures and minimal socio-demographic adjustment, sensitivity analyses were conducted to examine longitudinal exposures (i.e., annual rate of change between v_1 and v_2) and additional adjustments (**Supplemental Methods 2, 3**).

Using R version 3.6.1, selected findings for Model D, were presented using volcano plots (R Foundation for Statistical Computing, 2013). These plots display $\text{Log}_{10}(p\text{-values})$ for each set of models against b on the X-axis, highlighting findings with larger b . For dMRI results, these plots were presented separately for FA and MD, given their expected inverse correlation. Visualization of ROI-specific b with standard brain images was carried out using FSLeys software (Jenkinson and Smith, 2001; Jenkinson et al., 2002) applied to dMRI results (URL: <https://fsl.fmrrib.ox.ac.uk/fsl/fslwiki/FSLeys>).

Only ROIs with uncorrected p -value < 0.05 are presented.

RESULTS

Greater serum concentrations of 25(OH)D and folate were observed among Whites relative to AAs, with the reverse pattern observed for cobalamin. All three serum concentrations were consistently higher among “above poverty” participants (vs. below poverty), while only 25(OH)D and folate were higher in those aged >50 years at v_1 (vs. ≤ 50 years). Larger total and regional volumes among males, Whites, and those living above poverty (for total and GM volume) were detected compared to their counterparts ($p < 0.05$). The older group had smaller frontal GM volumes than the younger group, and differences by poverty status were mostly notable for occipital and frontal volumes (GM and WM). After multivariable adjustment, most poverty status differences in volumes became non-significant. For simplicity, only larger ROIs are presented (**Table 1**).

Top 10 adjusted associations with uncorrected $p < 0.05$ from ordinary least square brain scan-wide analyses are presented in **Tables 2–4**, **Supplemental Tables 3–5**, and **Figure 2**. Among significant findings (FWER < 0.05) in the main analysis (**Table 2**), serum 25(OH)D was directly associated with larger WM volumes [overall ($\beta = +910 \pm 336$, $p = 0.007$, $q = 0.067$, passed FW Bonferroni correction), effect size $b = 0.19$], with a stronger effect size among men ($b = 0.41$). This association was specific to occipital and parietal WM, with a moderate effect size ($b = +0.23\text{--}0.25$, $q < 0.05$, passed FW Bonferroni correction) in the overall sample, men and the older group. A trend toward a direct association was also detected between 25(OH)D and total brain volume in the overall sample, in men and those in the older group. Among trends (q -value < 0.10), temporal and occipital WM volumes were directly associated with 25(OH)D, in Whites and individuals living above poverty, respectively. Most of these 25(OH)D vs. larger ROIs associations were not altered when additional covariates were entered in a sensitivity analysis and were comparable in the sensitivity analysis for annual rate of change in 25(OH)D (**Table 2**). Higher cobalamin exhibited a trend association with larger total brain, total GM, frontal and occipital GM volumes in the overall sample (q -value < 0.10), becoming null after adjustment for 25(OH)D and other covariates (see **Supplemental Method 2**). In the sensitivity analysis (**Supplemental Table 3**), notable associations that survived addition of covariates included 25(OH)D over time increase in relation to larger TOTAL (overall, >50), WM (overall, males, >50 years), and GM (males) volumes, mostly in occipital and parietal regions.

For smaller ROI volumetric analysis (**Table 3**), 25(OH)D was significantly linked to larger left occipital pole volumes (FWER < 0.05 , $b = +0.35$), overall and among individuals living above poverty, with a trend among men and Whites. Other stratum-specific trends were noted between 25(OH)D and right post-central gyrus volume in men, and parietal and occipital WM volume in men and the older group. Folate's relation with right temporal pole was detected among Whites

TABLE 1 | Study sample characteristics by sex, age group, race and poverty status; HANDLS 2004–2009 and HANDLS-SCAN 2011–2015^a.

| | Total | Females | Males | ≤50 years | >50 years | White | African-American | Below poverty | Above poverty |
|---|-------------------|------------------------------|--------------------|------------------------------|------------------|-------------------------------|------------------|---------------------------------|-----------------|
| | (N = 240) | (N = 135) | (N = 105) | (N = 143) | (N = 97) | (N = 141) | (N = 99) | (N = 79) | (N = 161) |
| DEMOGRAPHIC FACTORS | | | | | | | | | |
| Sex, % males | 41.3 | — | — | 41.3 | 47.4 | 44.0 | 43.4 | 35.4 | 47.8 |
| Age _{v1} | 47.7 ± 8.9 | 47.7 ± 0.8 | 47.9 ± 0.8 | 41.6 ± 0.5 ^c | 56.7 ± 0.4 | 49.0 ± 0.7 ^{c,d} | 46.1 ± 1.0 | 44.3 ± 0.9 ^c | 49.3 ± 0.7 |
| Race, % AA | 41.2 | 41.5 | 41.0 | 46.9 ^{b,d} | 32.0 | — | — | 56.6 ^{c,d} | 74.5 |
| % above poverty | 67.1 | 62.2 | 73.3 | 57.3 ^c | 81.4 | 74.5 ³ | 56.6 | — | — |
| | (N = 183) | (N = 99) | (N = 84) | (N = 105) | (N = 78) | (N = 108) | (N = 75) | (N = 54) | (N = 129) |
| VITAMIN STATUS (v₁) | | | | | | | | | |
| 25(OH)D, ng/mL | 22.3 ± 10.8 | 20.9 ± 1.1 | 23.9 ± 1.1 | 20.5 ± 1.0 ^{c,d} | 24.7 ± 1.2 | 26.7 ± 1.0 ^c | 15.9 ± 0.9 | 17.2 ± 1.4 ^c | 24.4 ± 0.9 |
| Median | 20.0 | 19.0 | 23.0 | 19.0 | 22.5 | 25.5 | 15.0 | 15.5 | 23.0 |
| IQR | 14.0–31.0 | 12.0–30.0 | 16–32.5 | 12–29 | 16–33 | 19.0–34.5 | 10.0–19.0 | 9.0–21.0 | 16.0–33.0 |
| % < 20 | 37.1 | 40.7 | 32.4 | 39.2 | 34.0 | 20.6 ^c | 60.6 | 48.1 ^{c,d} | 31.7 |
| % < 10 | 9.6 | 12.6 | 5.7 | 14.0 ^{c,d} | 3.1 | 2.8 ^c | 19.2 | 20.3 ^c | 4.4 |
| | (N = 240) | (N = 135) | (N = 105) | (N = 143) | (N = 97) | (N = 141) | (N = 99) | (N = 79) | (N = 161) |
| Serum folate, ng/mL | 15.0 ± 6.3 | 15.0 ± 0.6 | 15.0 ± 0.6 | 13.5 ± 0.5 ^c | 17.4 ± 0.6 | 16.0 ± 0.5 ^{c,d} | 13.6 ± 0.6 | 13.1 ± 0.6 ^c | 16.1 ± 0.5 |
| Median | 14.3 | 14.7 | 14.2 | 12.6 | 17.9 | 15.4 | 12.7 | 12.5 | 15.2 |
| IQR | 9.5–20.6 | 9.2–20.6 | 9.5–20.5 | 8.9–17.1 | 12.2–22.5 | 10.6–21.3 | 8.5–17.5 | 8.6–17.1 | 10.6–21.3 |
| % < 6 | 6.3 | 7.4 | 4.8 | 8.4 | 3.1 | 4.3 | 9.1 | 7.6 | 5.6 |
| Serum B-12, pg/mL | 518.7 ± 239.7 | 535.4 ± 23.0 | 497.2 ± 19.3 | 502.7 ± 18.3 | 542.3 ± 27.1 | 488.0 ± 19.7 ^b | 562.6 ± 24.3 | 475.3 ± 19.2 ^b | 540.0 ± 20.9 |
| Median | 463.0 | 464.0 | 456.0 | 460.0 | 464.0 | 438.0 | 521.0 | 455 | 467.0 |
| IQR | 360.0–626.5 | 374.0–631.0 | 347–623.0 | 359–571 | 362.0–644.0 | 339.0–571.0 | 390.0–679.0 | 338.0–457.0 | 364.0–644.0 |
| % <200 | 0.42 | — | — | — | — | — | — | — | — |
| BRAIN VOLUMES (v_{scan}), mm³ | | | | | | | | | |
| Total brain volume | 970,454 ± 104,344 | 921,280 ± 6,311 ^c | 1,033,677 ± 10,198 | 978,724 ± 8,702 | 958,261 ± 10,569 | 989,978 ± 8,947 ^c | 942,645 ± 9,587 | 951,587 ± 11,157 ^{b,d} | 979,711 ± 8,343 |
| Gray matter | 513,545 ± 5,6152 | 488,776 ± 3,542 ^c | 545,391 ± 5,558 | 519,446 ± 4,752 | 504,846 ± 5,510 | 526,576 ± 4,657 ^c | 494,985 ± 5,249 | 502,325 ± 6,015 ^{b,d} | 518,559 ± 4,485 |
| White matter | 456,908 ± 51,582 | 432,504 ± 3,111 ^c | 488,286 ± 5,036 | 459,278 ± 4,214 | 453,414 ± 5,417 | 463,402 ± 4,531 ^b | 447,660 ± 4,720 | 448,261 ± 5,506 | 461,151 ± 4,134 |
| Gray matter: Frontal | 179,001 ± 20,690 | 170,642 ± 1,350 ^c | 189,748 ± 2,092 | 181,228 ± 1,788 ^b | 175,421 ± 1,947 | 183,082 ± 1,772 ^c | 173,188 ± 1890 | 175,430 ± 2,166 ^{b,d} | 180,752 ± 1,671 |
| Gray matter: temporal | 98,813 ± 11,598 | 93,343 ± 740 ^c | 105,847 ± 1,091 | 99,454 ± 982 | 97,869 ± 1,154 | 101,081 ± 956 ^c | 95,584 ± 1,128 | 96,870 ± 1255 | 99,767 ± 924 |
| Gray matter: occipital | 68,691 ± 9,035 | 65,145 ± 607 ^c | 73,251 ± 907 | 69,202 ± 765 | 67,937 ± 900 | 71,392 ± 730 ^c | 64,846 ± 817 | 66,637 ± 962 ^{c,d} | 69,699 ± 718 |
| Gray matter: parietal | 87,585 ± 11,259 | 83,786 ± 787 ^c | 92,470 ± 1,158 | 88,950 ± 930 ^b | 85,572 ± 1138 | 90,446 ± 926 ^c | 83,510 ± 1,044 | 85,916 ± 1,243 | 88,404 ± 891 |
| White matter: Frontal | 186,294 ± 21,618 | 176,870 ± 1,353 ^c | 198,412 ± 2,164 | 187,094 ± 1,791 | 185,115 ± 2,230 | 188,256 ± 1,888 | 183,500 ± 2,031 | 182,321 ± 2,275 ^{b,d} | 188,243 ± 1,739 |
| White matter: temporal | 104,302 ± 12,020 | 98,399 ± 688 ^c | 111,893 ± 1,181 | 104,782 ± 969 ^e | 103,596 ± 1,284 | 106,1044 ± 1,050 ^c | 101,750 ± 1,107 | 102,559 ± 1,268 | 105,158 ± 970 |
| White matter: occipital | 45,860 ± 6,113 | 43,155 ± 414 ^c | 49,338 ± 571 | 46,394 ± 509 ^e | 45,073 ± 619 | 46,879 ± 538 ^c | 44,410 ± 543 | 44,775 ± 627 ^{b,d} | 46,392 ± 497 |
| White matter: parietal | 90,621 ± 11,436 | 85,721 ± 765 ^c | 96,920 ± 1,101 | 91,074 ± 939 | 89,951 ± 1,193 | 92,253 ± 1,018 ^b | 88,295 ± 1,009 | 89,171 ± 1,270 | 91,332 ± 904 |

25(OH)D, 25-hydroxyvitamin D; Age_{v1}, age measured at HANDLS visit 1 (2004–2009); HANDLS, Healthy Aging in Neighborhoods of Diversity Across the Life Span; HANDLS-SCAN, Brain magnetic resonance imaging scan ancillary study of HANDLS; IQR, Interquartile range (25th–75th percentile); v₁, visit 1 of HANDLS (2004–2009); v_{scan}, HANDLS-SCAN visit (2011–2015).

^aValues are Mean ± SD for totals and Mean ± SE for stratum-specific, or %. For 25(OH)D, folate and vitamin B-12, medians and inter-quartile ranges (IQR) were also provided. N = 183 for 25(OH)D analysis. The sample is that of HANDLS participants with complete visit 1 folate/B-12 measures and sMRI data [N = 240 for most analysis; N = 183 for 25(OH)D]. See methods for cutoffs chosen for each vitamin. Cobalamin deficiency analysis yielded only 1 participant below the 200 pg/mL cutoff. Thus, stratified analysis was not conducted.

^bP < 0.05.

^cP < 0.010 for null hypothesis of no difference by sex, age group, race, or poverty status, t-test (continuous variables), and chi-squared test (categorical variables).

^dP ≥ 0.05 after adjustment for remaining covariates, multiple linear regression (continuous variables), multiple logistic regression (categorical variables).

^eP < 0.05 after adjustment for remaining covariates, multiple linear regression (continuous variables), multiple logistic regression (categorical variables).

TABLE 2 | Top 10 adjusted associations from models A (total, GM, WM) and B (regional GM, WM) vs. visit 1 exposures: serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected $P < 0.05$: ordinary least square brain scan-wide analyses on HANDLS 2004–2009 and HANDLS-SCAN 2011–2015^a.

| | Outcome (Vscan) | Outcome description | Exposure (v ₁) | Stratum | (N) | β | (SE) | P_{uncorr} | Standardized Beta (b) | q-value | Passes FW Bonferroni correction | Standardized Beta (b): SA ^b | P_{uncorr} : SA |
|----------------|---------------------|-------------------------------|----------------------------|---------------|--------------|--------------------------|--------------|---------------------|-----------------------|--------------------|---------------------------------|--|--------------------------|
| MODEL A | | | | | | | | | | | | | |
| Overall | WM | White matter | 25(OH)D | — | (186) | +910 | (336) | 0.007 | +0.19 | 0.067 | Yes | +0.18 | 0.017 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | — | (186) | +1554 | (659) | 0.019 | +0.16 | 0.087 ^d | No | +0.15 | 0.033 |
| Stratified | WM | White matter | 25(OH)D | Males | (87) | +2054^c | (599) | 0.001 | +0.41 | 0.069 | Yes | +0.43 | 0.002 |
| | WM | White matter | 25(OH)D | >50 years | (80) | +1500 ^c | (470) | 0.002 | +0.31 | 0.076 ^d | No | +0.25 | 0.017 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | Males | (87) | +3537 ^c | (1180) | 0.004 | +0.34 | 0.087 ^d | No | +0.38 | 0.005 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | >50 years | (80) | +2551 ^c | (891) | 0.005 | +0.28 | 0.098 ^d | No | +0.22 | 0.023 |
| | GM | Gray matter | 25(OH)D | Males | (87) | +1481 | (630) | 0.021 | +0.26 | 0.29 | No | +0.30 | 0.022 |
| | WM | White matter | 25(OH)D | AP | (132) | +930 | (406) | 0.024 | +0.18 | 0.29 | No | +0.16 | 0.088 |
| | GM | Gray matter | 25(OH)D | >50 years | (80) | +1051 | (471) | 0.029 | +0.22 | 0.29 | No | +0.19 | 0.052 |
| | GM | Gray matter | B-12 | AP | (161) | +28 | (13) | 0.034 | +0.13 | 0.29 | No | +0.08 | 0.26 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | AP | (132) | +1663 | (789) | 0.037 | +0.16 | 0.29 | No | +0.15 | 0.085 |
| | TOTALBRAIN | Total brain volume | B-12 | AP | (161) | 52 | (26) | 0.044 | +0.13 | 0.29 | No | +0.07 | 0.31 |
| MODEL B | | | | | | | | | | | | | |
| Overall | OCCIPITAL_WM | Occipital white matter | 25(OH)D | — | (186) | +140 | (40) | 5.2e-04 | +0.25 | 0.012 | Yes | +0.24 | 0.001 |
| | PARIETAL_WM | Parietal white matter | 25(OH)D | — | (186) | +251 | (77) | 1.5e-03 | +0.23 | 0.017 | Yes | +0.22 | 0.004 |
| Stratified | PARIETAL_GM | Parietal gray matter | 25(OH)D | — | (186) | +191 | (74.9) | 1.2e-02 | +0.18 | 0.086 ^d | No | +0.18 | 0.016 |
| | FRONTAL_GM | Frontal gray matter | B-12 | — | (240) | +11.2 | (5) | 1.6e-02 | +0.13 | 0.086 ^d | No | +0.07 | 0.27 |
| | OCCIPITAL_GM | Occipital gray matter | B-12 | — | (240) | +4.8 | (2.0) | 1.8e-02 | +0.13 | 0.086 ^d | No | +0.10 | 0.12 |
| | TEMPORAL_WM | Temporal white matter | 25(OH)D | — | (186) | +178 | (77) | 2.2e-02 | +0.16 | 0.089 ^d | No | +0.15 | 0.039 |
| | FRONTAL_WM | Frontal white matter | 25(OH)D | — | (186) | +309 | (149) | 3.9e-02 | +0.15 | 0.13 | No | +0.13 | 0.079 |
| | OCCIPITAL_WM | Occipital white matter | 25(OH)D | Males | (87) | +261^c | (67) | 2.1e-04 | +0.44 | 0.020 | Yes | +0.45 | 0.001 |
| | PARIETAL_WM | Parietal white matter | 25(OH)D | Males | (87) | +486^c | (129) | 3.1e-04 | +0.44 | 0.020 | Yes | +0.45 | 0.001 |
| | OCCIPITAL_WM | Occipital white matter | 25(OH)D | >50 | (80) | +205 | (54) | 3.2e-04 | +0.37 | 0.020 | Yes | +0.27 | 0.005 |
| | PARIETAL_WM | Parietal white matter | 25(OH)D | >50 | (80) | +393^c | (108) | 5.4e-04 | +0.37 | 0.020 | Yes | +0.32 | 0.004 |
| | OCCIPITAL_WM | Occipital white matter | 25(OH)D | AP | (132) | +156 | (48) | 1.3e-03 | +0.25 | 0.050 ^d | No | +0.26 | 0.004 |
| | OCCIPITAL_WM | Occipital white matter | 25(OH)D | Whites | (109) | +155 | (49) | 2.2e-03 | +0.25 | 0.063 ^d | No | +0.28 | 0.002 |
| | FRONTAL_WM | Frontal white matter | 25(OH)D | Males | (87) | +826 ^c | (262) | 2.3e-03 | +0.38 | 0.063 ^d | No | +0.42 | 0.003 |
| | TEMPORAL_WM | Temporal white matter | 25(OH)D | >50 | (80) | +326 ^c | (108) | 3.5e-03 | +0.29 | 0.084 ^d | No | +0.23 | 0.024 |
| | TEMPORAL_GM | Temporal gray matter | FOL | Whites | (109) | −354 ^c | (123) | 4.7e-03 | −0.20 | 0.10 | No | −0.26 | 0.004 |
| | FRONTAL_GM | Frontal gray matter | B-12 | AP | (132) | +13.4 | (5.1) | 9.7e-03 | +0.17 | 0.18 | No | +0.09 | 0.22 |

25(OH)D, 25-hydroxyvitamin D; AP, Above poverty; B-12, serum cobalamin (vitamin B-12); FDR, False Discovery Rate; FOL, serum folate; FWER, FamilyWise Error Rate; GM, Gray Matter; SA, Sensitivity Analysis; SE, Standard Error; WM, White Matter.

^aValues are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, $FWER < 0.05$.

^bBased on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (see **Supplemental Methods 2**). Note that for visit 1 25(OH)D, no additional covariates were selected. For Folate and B-12 a reduced set of additional covariates were included and are listed in **Supplemental Methods 2**.

^c $P < 0.10$ for null hypothesis that exposure \times stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^dFinding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥ 0.20 .

TABLE 3 | Top 10 adjusted associations from model C, small sMRI regions vs. visit 1 exposures: serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected $P < 0.05$: ordinary least square brain scan-wide analyses on HANDLS 2004–2009 and HANDLS-SCAN 2011–2015^a.

| Outcome (v _{scan}) | Outcome description | Exposure (v ₁) | Stratum | (N) | β | (SE) | P | Standardized Beta (b) | q-value | Passes FW Bonferroni correction | Standardized Beta (b): SA ^b | P _{uncorr} : SA |
|----------------------------------|--|----------------------------|-----------|--------------|--------------------------|---------------|----------------|-----------------------|--------------------|---------------------------------|--|--------------------------|
| OVERALL | | | | | | | | | | | | |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | — | (186) | +15.70 | (3.83) | 6.3e-05 | +0.31 | 0.026 | Yes | +0.27 | <0.001 |
| occipital_lobe_WM_left | Occipital lobe, white matter, left | 25(OH)D | — | (186) | +76.8 | (20.7) | 2.9e-04 | +0.26 | 0.061 ^d | No | +0.26 | <0.001 |
| Right_PoG_post-central_gyrus | Post-central gyrus, right | 25(OH)D | — | (186) | +34.8 | (9.7) | 4.3e-04 | +0.27 | 0.061 ^d | No | +0.27 | 0.001 |
| parietal_lobe_WM_right | Parietal lobe, white matter, right | 25(OH)D | — | (186) | +127.9 | (38.1) | 9.8e-04 | +0.24 | 0.10 ^d | No | +0.23 | 0.002 |
| Left_PoG_post-central_gyrus | Post-central gyrus, left | 25(OH)D | — | (186) | +34.1 | (10.4) | 1.3e-03 | +0.25 | 0.11 ^d | No | +0.25 | 0.002 |
| Right_TrlFG_triangular_part_of_t | Triangular part of the inferior frontal gyrus, right | B-12 | — | (240) | +0.45 | (0.14) | 2.2e-03 | +0.20 | 0.13 | No | +0.19 | 0.017 |
| parietal_lobe_WM_left | Parietal lobe, white matter, left | 25(OH)D | — | (186) | +123.4 | (40.4) | 3.1e-03 | +0.22 | 0.13 ^d | No | +0.21 | 0.007 |
| occipital_lobe_WM_right | Occipital lobe, white matter, right | 25(OH)D | — | (186) | +63.6 | (21.1) | 3.0e-03 | +0.21 | 0.13 ^d | No | +0.21 | 0.005 |
| Right_TMP_temporal_pole | Right temporal pole | FOL | — | (240) | −35.5 | (11.9) | 2.7e-03 | −0.19 | 0.13 | No | −0.22 | 0.010 |
| Anterior insula, right | Right_Alns_anterior_insula | B-12 | — | (240) | +0.36 | (0.12) | 3.2e-03 | +0.17 | 0.13 | No | +0.13 | 0.071 |
| STRATIFIED | | | | | | | | | | | | |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | AP | (132) | +19.0^c | (4.3) | 2.0e-05 | +0.35 | 0.07 | Yes | +0.32 | <0.001 |
| Right_TMP_temporal_pole | Right temporal pole | FOL | Whites | (141) | −63.9 ^c | (15.2) | 4.8e-05 | −0.34 | 0.08 ^d | No | −0.42 | <0.001 |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | Men | (87) | +24.0 | (5.8) | 8.0e-05 | +0.45 | 0.09 ^d | No | +0.46 | <0.001 |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | Whites | (109) | +17.7 | (4.5) | 1.6e-04 | +0.33 | 0.11 ^d | No | +0.31 | 0.001 |
| Right_PoG_post-central_gyrus | Right post-central gyrus | 25(OH)D | Men | (87) | +64.4 ^c | (16.6) | 1.6e-04 | +0.43 | 0.13 ^d | No | +0.47 | 0.001 |
| Parietal_lobe_WM_right | Right parietal lobe, White matter | 25(OH)D | Men | (87) | +242.6 ^c | (63.4) | 2.6e-04 | +0.45 | 0.13 ^d | No | +0.46 | 0.001 |
| occipital_lobe_WM_left | Occipital lobe, white matter, left | 25(OH)D | >50 | (80) | +107.7 | (28.0) | 3.4e-04 | +0.37 | 0.14 ^d | No | +0.28 | 0.004 |
| parietal_lobe_WM_left | Parietal lobe, white matter, left | 25(OH)D | >50 | (80) | +201.8 ^c | (53.6) | 3.4e-04 | +0.39 | 0.14 ^d | No | +0.34 | 0.003 |
| occipital_lobe_WM_right | Occipital lobe, white matter, right | 25(OH)D | Men | (87) | +132.3 ^c | (35.9) | 4.1e-04 | +0.43 | 0.14 ^d | No | +0.44 | 0.001 |
| Right_PHG_parahippocampal_gyrus | Right parahippocampal gyrus | FOL | Whites | (141) | −20.6 ^c | (5.7) | 4.2e-04 | −0.27 | 0.14 | No | −0.38 | <0.001 |

25(OH)D, 25-hydroxyvitamin D; AP, Above poverty; B-12, serum cobalamin (vitamin B-12); FDR, False Discovery Rate; FOL, serum folate; FWER, FamilyWise Error Rate; GM, Gray Matter; SA, Sensitivity Analysis; SE, Standard Error; WM, White Matter.

^aValues are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, FWER < 0.05.

^bBased on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (see **Supplemental Methods 2**). Note that for visit 1 25(OH)D, no additional covariates were selected. For Folate and B-12 a reduced set of additional covariates were included and are listed in **Supplemental Methods 2**.

^c $P < 0.10$ for null hypothesis that exposure \times stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^dFinding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥ 0.20 .

TABLE 4 | Top 10 adjusted associations from model D, bilateral means of MD and FA from dMRI vs. visit 1 exposures: serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected $P < 0.05$: ordinary least square brain scan-wide analyses on HANDLS 2004–2009 and HANDLS-SCAN 2011–2015^a.

| Outcome (v_{scan}) | Outcome description | Exposure (v_1) | Stratum | (N) | β | (SE) | P | Standardized Beta (b) | q-value | Passes FW Bonferroni correction | Standardized Beta (b): SA ^b | P_{uncorr} : SA |
|---------------------------|--|-----------------------|-----------|--------------|------------------------|-------------------|----------------|--------------------------|--------------------------|---------------------------------------|---|----------------------|
| OVERALL | | | | | | | | | | | | |
| alic_b_tr | Anterior limb of the internal capsule, Mean diffusivity, bilateral mean | FOL | — | (240) | −5.64e-06 | (1.56e-06) | 3.8e-04 | −0.23 | 0.074^d | Yes | −0.26 | 0.003 |
| cgc_b_fa | Cingulum (Cingulate Gyrus), fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0007 | (0.0002) | 4.1e-04 | +0.31 | 0.074^d | Yes | +0.28 | 0.002 |
| alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0006 | (0.0002) | 9.7e-04 | +0.29 | 0.12 ^d | No | +0.22 | 0.005 |
| mcp_b_tr | Middle cerebellar peduncle, mean diffusivity, bilateral mean | B-12 | — | (240) | −1.45e-07 | (4.81e-08) | 2.8e-03 | −0.19 | 0.22 | No | −0.18 | 0.019 |
| mfowm_b_tr | Middle Fronto-Orbital WM, mean diffusivity, bilateral mean | FOL | — | (240) | −5.68e-06 | (1.93e-06) | 3.7e-03 | −0.19 | 0.22 | No | −0.23 | 0.019 |
| cgh_b_fa | Cingulum (Hippocampus), fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0006 | (0.0002) | 3.9e-03 | +0.25 | 0.22 | No | +0.21 | 0.023 |
| icp_b_fa | Inferior cerebellar peduncle, fractional anisotropy, bilateral mean | FOL | — | (240) | +0.0009 | (0.0003) | 4.5e-03 | +0.19 | 0.22 | No | +0.22 | 0.015 |
| ss_b_fa | Sagittal Stratum, fraction anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0004 | (0.0002) | 4.9e-03 | +0.25 | 0.22 | No | +0.20 | 0.010 |
| mowm_b_tr | Middle Occipital WM, mean diffusivity, bilateral mean | FOL | — | (240) | −4.13e-06 | (1.50e-06) | 6.5e-03 | −0.18 | 0.22 | No | −0.17 | 0.024 |
| put_b_tr | Putamen, mean diffusivity, bilateral mean | FOL | — | (240) | −4.22e-06 | (1.54e-06) | 6.5e-03 | −0.18 | 0.22 | No | −0.26 | 0.004 |
| STRATIFIED | | | | | | | | | | | | |
| alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | Whites | (109) | +0.0009 ^c | (0.0002) | 8.6e-05 | +0.37 | 0.11 ^d | No | +0.32 | 0.001 |
| bcc_b_tr | Body of corpus callosum, Mean diffusivity, bilateral mean | 25(OH)D | BP | (52) | −0.00002 ^c | (4.43e-06) | 8.7e-05 | −0.53 | 0.11 ^d | No | −0.61 | 0.001 |
| cgc_b_fa | Cingulum (Cingulate Gyrus), fractional anisotropy, bilateral mean | 25(OH)D | Whites | (109) | +0.0008 | (0.0002) | 1.1e-04 | +0.39 | 0.11 ^d | No | +0.36 | <0.001 |
| sowm_b_fa | Superior Occipital WM, fractional anisotropy, bilateral mean | FOL | Males | (103) | +0.0016 ^c | (0.0004) | 2.1e-04 | +0.39 | 0.12 ^d | No | +0.31 | 0.007 |
| unc_b_tr | Uncinate Fasciculus, mean diffusivity, bilateral mean | FOL | AA | (98) | 2.2e-04 ^c | (2.33e-06) | 3.4e-04 | −0.40 | 0.12 ^d | No | −0.39 | 0.004 |
| alic_b_tr | Anterior limb of the internal capsule, Mean diffusivity, bilateral mean | FOL | AP | (163) | −6.44e-06 | 1.72e-06 | 4.6e-04 | −0.27 | 0.12 ^d | No | −0.30 | 0.004 |
| scc_b_tr | Splenium of Corpus Callosum, Mean diffusivity, bilateral mean | 25(OH)D | BP | (52) | −0.000015 ^c | (3.80e-06) | 3.0e-04 | −0.50 | 0.12 ^d | No | −0.63 | 0.001 |
| sowm_b_tr | Superior Occipital WM, mean diffusivity, bilateral mean | FOL | Males | (103) | −0.00001 ^c | (3.53e-06) | 4.6e-04 | −0.37 | 0.15 ^d | No | −0.38 | <0.001 |
| alic_b_tr | Anterior limb of the internal capsule, Mean diffusivity, bilateral mean | FOL | >50 years | (96) | −0.00001 ^c | (2.92e-06) | 2.8e-04 | −0.36 | 0.15 ^d | No | −0.44 | 0.011 |
| cgc_b_fa | Cingulum (Cingulate Gyrus), fractional anisotropy, bilateral mean | 25(OH)D | BP | (52) | +0.00150 | 0.00040 | 5.8e-04 | +0.57 | 0.17 ^d | No | +0.59 | 0.003 |

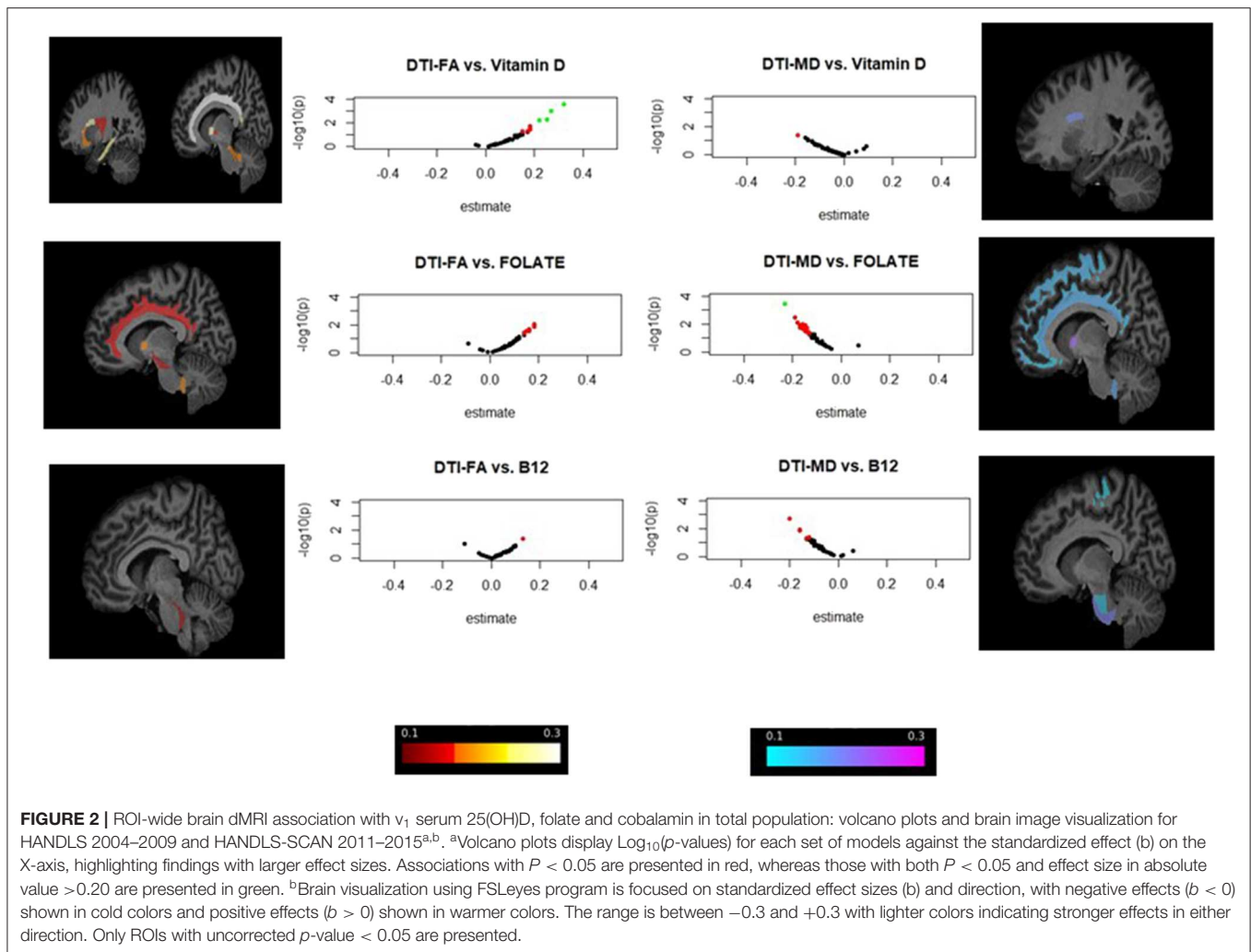
25(OH)D, 25-hydroxyvitamin D; AP, Above poverty; B-12, serum cobalamin (vitamin B-12); FOL, serum folate; FWER, FamilyWise Error Rate; GM, Gray Matter; SA, Sensitivity Analysis; SE, Standard Error; WM, White Matter.

^aValues are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, FWER < 0.05.

^bBased on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (see **Supplemental Methods 2**). Note that for visit 1 25(OH)D, no additional covariates were selected. For Folate and B-12 a reduced set of additional covariates were included and are listed in **Supplemental Methods 2**.

^c $P < 0.10$ for null hypothesis that exposure \times stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^dFinding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥ 0.20 .



($p < 0.05$, $q < 0.10$ per vitamin, $b = -0.34$). In the sensitivity analysis (Supplemental Table 4), among top 10 findings, over-time increase in cobalamin was associated with larger left orbital part of the inferior frontal gyrus ($b = +0.24$, $p = 0.001$). The inverse relationship between longitudinal increase in folate and the right temporal pole volume among Whites was attenuated with additional model adjustment for potential confounders ($p_{\text{full}} = 0.074$). The volume of the anterior limb of the internal capsule (ALIC) was directly associated with rate of increase 25(OH)D in a bi-lateral manner, among older individuals.

In the dMRI analysis (Table 4 and Figure 2), both folate and 25(OH)D were significantly associated with better WMI, overall, in two key regions: Lower MD in the ALIC region for folate ($b = -0.23$, FWER < 0.05), and higher FA in the cingulum (cingulate gyrus) for 25(OH)D (FWER < 0.05 , $b = +0.31$). No significant or trend associations were detected between vitamin B-12 and dMRI measures. In the sensitivity analysis (Supplemental Table 5), results for 25(OH)D, but not folate, were comparable to v_1 exposures with additional notable positive associations found between rate of increase in 25(OH)D and the cingulum (Hippocampus)

FA, which was statistically significant overall (FWER < 0.05 , $b = +0.23$).

Figure 2 highlights the strongest effect sizes and their associated uncorrected p -values observed in the dMRI analysis (Model D), through a series of volcano plots applied to the overall study sample, applied to v_1 exposures. Effect sizes and direction were also visualized on standard ROI-specific brain images, for associations with $p_{\text{uncorr}} < 0.05$.

DISCUSSION

This study is among few that used a brain scan-wide analysis methodology to test associations of serum 25(OH)D, folate and cobalamin with brain volumes and WMI and the first to do so among socio-demographically diverse adults. The 3 vitamin status measures were systematically correlated with sMRI/dMRI brain markers, from low-to-high segmentation levels. We found statistically significant (FWER < 0.05) direct associations of 25(OH)D(v_1) with total, occipital and parietal WM volumes, particularly among men and older participants and with left occipital pole volume, overall and among individuals living above

poverty. The latter findings were replicated for 25(OH)D (v_2 - v_1). Only trends were detected for cobalamin exposures ($q < 0.10$), while serum folate (v_1) was associated with lower mean diffusivity (MD) in ALIC, reflecting greater WMI, overall.

In terms of 25(OH)D and sMRI markers, vitamin D deficiency appears to be associated with smaller hippocampal subfields in MCI participants (Karakis et al., 2016; Al-Amin et al., 2019). Our study indicated that 25(OH)D was inversely linked to WM volumes, particularly in the left occipital pole. The occipital pole encompasses the primary visual cortex and contributes to language abilities (Charles et al., 1997; Melrose et al., 2009). Decline in verbal fluency has been related to lower 25(OH)D status (Beydoun et al., 2018; Goodwill et al., 2018). Relations of vitamin D deficiency with smaller WM volumes and poorer integrity were shown elsewhere (Buell et al., 2010; Prager et al., 2014; Annweiler et al., 2015b; Del Brutto et al., 2015). Vitamin D status was also associated with larger GM volumes (Brouwer-Brolsma et al., 2015), smaller ventricles (Annweiler et al., 2013) or not related to brain markers (Michos et al., 2014; Littlejohns et al., 2016). Our race-specific associations are notable, possibly due to genetic polymorphisms determining brain vitamin D status, which pending further studies, may be higher among Whites compared to AAs (Powe et al., 2013; Berg et al., 2015).

Among comparable ROI-specific dMRI studies, a cross-sectional study (Moon et al., 2015), found an inverse association between 25(OH)D and FA values near the inferior and superior longitudinal fasciculi, corpus callosum (genu), the anterior corona radiata, the ALIC and the cingulum bundle. Most regional FAs, particularly the ALIC and cingulum bundle (cingulate and hippocampus), were found to be positively associated with 25(OH)D in our study. These associations were statistically significant for annual rates of change in 25(OH)D, specifically for ALIC and the hippocampus.

Similarly, folate and cobalamin were previously linked to larger brain volumes (or slower atrophy), specifically within hippocampal and amygdala regions (Scott et al., 2004; Vogiatzoglou et al., 2008; Lee et al., 2016) and reduced WM lesion severity (De Lau et al., 2009; Pieters et al., 2009). In our study, cobalamin was related to occipital and temporal GM volumes, an association that was attenuated with full covariate-adjustment. B-6 and cobalamin intakes were also shown to spare GM atrophy, with specific association between cobalamin status and bi-lateral superior parietal sulcus (Erickson et al., 2008). Moreover, direct relationship between cobalamin status and regional GM volume (right precuneus, right post-central gyrus and left inferior parietal lobule) in AD was found mostly among ApoE4+ individuals (Lee et al., 2016). Our study showed a trend between increasing levels of cobalamin and larger parts of the inferior frontal gyrus [orbital (left); triangular (right)], known for its function in processing speech and language (Greenlee et al., 2007). A longitudinal study of adults found that lower cobalamin status, but not folate, was linked to increased rate of brain volume loss. A recent trial (VITACOG) conducted among MCI patients showed that GM regions vulnerable to AD, such as the medial temporal lobe, benefited from high-dose B vitamin supplementation by slowing atrophy rates over 2 years, though this pertained only to hyperhomocysteinemic individuals

(Douaud et al., 2013), and this trial indicated that B vitamin supplementation can stabilize executive functions and reduce decline in global cognition, episodic and semantic memory (De Jager et al., 2012).

Novel are our findings that folate and 25(OH)D are inversely related to MD while being directly associated with FA, particularly in the ALIC region. This is corroborated by a direct association between annual 25(OH)D increase and ALIC volumes at follow-up. While previous studies have linked vitamin D and folate deficiency to WM damage (Sachdev et al., 2002; Bleich and Kornhuber, 2003; Den Heijer et al., 2003; Dufouil et al., 2003; Scott et al., 2004; Censori et al., 2007; De Lau et al., 2009; Pieters et al., 2009; Buell et al., 2010; Prager et al., 2014; Annweiler et al., 2015b; Del Brutto et al., 2015; Moon et al., 2015; Wu et al., 2015; Lee et al., 2017), our study further specified most affected ROIs and target socio-demographic groups. The ALIC connects the thalamus with the frontal lobe, suggesting these nutrients can maintain cognitive functions that are reliant on frontothalamic connectivity, such as executive function (Schoenberg and Scott, 2011; Jacobs et al., 2013). Despite folate not being consistently associated with executive function or attention (Rosenberg, 2008), it was inversely related to depression (Bender et al., 2017) and reduced ALIC FA prevails in depressive disorders (Zou et al., 2008; Jia et al., 2010; Chen et al., 2016). Moreover, depressive symptoms increase dementia risk (Tan et al., 2019). Thus, future studies could explore mediation of the depression-AD relationship through ALIC FA and MD as the mechanism for folate supplementation prevention.

Our findings indicate that in certain sub-groups, folate may adversely affect volumetric markers, specifically the right temporal pole volume, thought to contribute to personal and episodic memories, also shown to be linked with empathy (Rankin et al., 2006). The literature shows an interaction between folate and cobalamin status, whereby high folate status coupled with cobalamin deficiency was associated with smaller GM volumes in the right middle occipital gyrus and the opercular part of the inferior frontal gyrus (Deng et al., 2017). Thus, abnormally high levels of folate may relate to poorer outcomes, though this finding may be spurious and due to chance, requiring replication in a larger meta-analytic studies.

Our study has several notable strengths. First, it examined the association between several AD-related nutritional biomarkers with brain structural sMRI and dMRI measures reflecting regional volumes and WMI, potentially underlying various neuropathologies. Moreover, while cross-sectional, this study provided 5–6 years of latency between exposure (nutritional biomarkers) and outcome (brain MRI measures) and secondarily tested associations between exposure trajectories and follow-up outcomes, with stratum-specific heterogeneity and adjusting for multiple testing. Additionally, given that serum 25(OH)D was recently linked to lower intracranial volume (ICV) (Annweiler et al., 2015a), our detected positive association between 25(OH)D and brain volumes, including WM, may be conservative and under-estimated, and may be inflated upon ICV adjustment.

Nevertheless, study findings should be interpreted with caution given limitations. First, due to dMRI voxel size limitations, partial volume effects and possible contamination by

nearby cerebral spinal fluid can occur, increasing FA and MD estimation errors. Second, timing of blood sample collection and measurement errors may have affected the sample distribution of serum 25(OH)D levels, with overestimation as a possibility as 10%-15% of the measured 25(OH)D values are in fact 24,25-dihydroxyvitamin D, which is recognized by the same antibody. Third, the 25(OH)D assay in HANDLS was measured using two different methodologies at v_1 and v_2 . Thus, our sensitivity analyses may be biased due to exposure measurement error. The moderate correlation between visits in 25(OH)D ($r = 0.44$) suggests a minimal error, though inter-assay comparisons are needed. Fourth, the latency between exposure and outcome could make the findings somewhat speculative when compared to a cohort study whereby baseline exposure is being tested against annualized change in outcome. The lack of a baseline sMRI/dMRI measure is a notable limitation of this study that should be remedied in further studies of comparable populations. Other potential limitations include the lack of other related serum measures, such as Hcy and vitamin B-6 in HANDLS, the lack of longer term markers, such as red blood cell folate, residual confounding particularly by physical activity which was not adequately measured at v_1 and v_2 , non-participation selection bias, and a lower powered stratum-specific associations especially by race and poverty status. Due to differences in dietary intakes, absorption, utilization, distribution or other confounding conditions, circulating levels of target vitamins may not reflect their brain tissue levels, reducing their value as biomarkers. Moreover, our strongest findings implicate 25(OH)D as the main exposure, which may confound the association of serum folate with region-specific WMI. A larger meta-analytic study may be needed to disentangle those associations. Finally, external validity may be limited to inner US cities with similar racial/ethnic and socio-economic diversity as Baltimore City, as well as to middle-aged adults.

In summary, serum 25(OH)D status and increase were consistently linked to larger occipital and parietal WM volumes. WMI in ALIC and cingulum (hippocampus) were significantly associated with faster increase in 25(OH)D over time. Pending longitudinal replication of our findings, future interventions should test vitamin D supplementation against regional volumetric and diffusion brain markers and mechanistic studies are needed to examine regional vulnerability to vitamin status.

DATA AVAILABILITY STATEMENT

Data are available upon request to researchers with valid proposals who agree to the confidentiality agreement as required by our Institutional Review Board. We publicize our policies on our website <https://handls.nih.gov>, which contains the code book for the parent study, HANDLS. Requests for data access may be sent to the PIs or the study manager, Jennifer Norbeck at norbeckje@mail.nih.gov. These data are owned by the National Institute on Aging at the National Institutes of Health. The Principal Investigators, have restricted public access to these data because (1) the study collects medical, psychological, cognitive, and psychosocial information on racial and poverty differences

that could be misconstrued or willfully manipulated to promote racial discrimination; and (2) although the sample is fairly large, there are sufficient identifiers that the PIs cannot guarantee absolute confidentiality for every participant as we have stated in acquiring our confidentiality certificate. Analytic scripts and code book specific to HANDLS-SCAN can be obtained from the corresponding author upon request.

ETHICS STATEMENT

The studies involving human participants were reviewed and approved by National Institute on Environmental Health Sciences IRB committee. The patients/participants provided their written informed consent to participate in this study.

AUTHOR CONTRIBUTIONS

MB contributed to the study concept, planned the analysis, conducted the data management and statistical analysis, conducted the literature review, wrote and revised the manuscript. DS planned the analysis, conducted the data management, conducted the literature review, wrote and revised the parts of the manuscript. SH conducted the literature search and review, assisted in statistical analysis, wrote the parts of the manuscript, and revised the manuscript. HB planned the analysis, conducted the literature review, wrote the parts of the manuscript, and revised the manuscript. LK, CD, RG, SS, and ME acquired the data, wrote and revised the parts of the manuscript. GE acquired the data, planned the analysis, assisted in data management and statistical analysis, wrote and revised the parts of the manuscript. AZ and SW acquired the data, the planned analysis, wrote and revised the parts of the manuscript.

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SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fnagi.2020.00140/full#supplementary-material>

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Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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Vitamin D, folate and cobalamin status and change are related to brain volume and white matter integrity in urban adults

Beydoun et. al.

ONLINE SUPPLEMENTARY MATERIAL

Supplemental Method 1. Brain structural/diffusion (s) magnetic resonance imaging (MRI) and diffusion (d)

MRI detailed description:

HANDLS description

sMRI

The T1-weighted MP-RAGE images covered the whole brain in a sagittal plane at a thickness of 1.2 mm for 160 slices (TR/TE/TI=2300/2.9/900 ms; FOV 25.6cm). These images were converted from sagittal to axial sections for comparative purposes.

The Section for Biomedical Image Analysis at the University of Pennsylvania developed in-house techniques to preprocess structural MRI scans. First, extra-cranial material on the T1-weighted images was removed using a multi-atlas registration method requiring minimal correction by hand (Doshi et al., 2013). Multiplicative intrinsic component optimization (MICO) method was used to correct for bias (Li et al., 2014). Multi-atlas region Segmentation utilizing Ensembles (MUSE), segmented pre-processed images into a set of anatomical regions of interest (ROIs) (Doshi et al., 2016). MUSE integrates a broad ensemble of labeled templates by using a number of warping algorithms, regularization atlases and parameters (Doshi et al., 2016).

dMRI

Isotropic resolution images were acquired with an in-plane resolution of 2x2 mm and 2 mm slice thickness over a 22.4 cm FOV. A total of 66 slices at a TE = 122ms, TR = 3300ms, and flip angle = 90° were used. Eddy current effects were reduced by using bipolar diffusion. Diffusion weighting scheme was a 2-shell (b = 1000, 2500), optimized for uniform sampling of each shell and non-overlapping diffusion directions of 60 and 120 for each shell, respectively, and 6 b0 volumes. The image acquisition time was ten minutes.

Joint Linear Minimum Mean Squared Error denoising software (jLMMSE; Tristan-Vega and Aja-Fernandez, 2010) was used to de-noise the raw DWI data. The DT images were reconstructed by fitting the de-noised DWI data

using multivariate linear fitting. Motion correction was conducted with FSL's "eddycorrect" tool (Andersson and Sotiropoulos, 2016).

Fractional Anisotropy (FA) – a widely established method for quantifying WMI sensitive to the degree of myelination, density, and organization of WM – was used to determine directionality of water diffusion in the brain. It measures the degree of anisotropy of the diffusion at the voxel level. It is derived from the variance of the average of the three eigenvalues of the diffusion tensor that are used to compute FA values, ranging from 0 to 1; 0 indicates completely unrestricted diffusion, and 1 denotes completely restricted diffusion. Computing the sum of the eigenvalues of the diffusion tensor yields the TR or mean diffusivity (MD), with a higher value indicative of poorer WMI. (Jones, 2008).

Quality assurance

The Core for Translational Research in Imaging @ Maryland (C-TRIM), managed by the Department of Diagnostic Radiology at UMB's School of Medicine, has instituted several quality control measures to ensure highest level of quality (and safety). The research dedicated scanner undergoes routine American College of Radiology mandated daily quality assurance(Mulkern et al., 2008). In addition, the AD Neuroimaging Initiative phantom is used to assess weekly signal-to-noise ratio and monthly structural distortions(Gunter et al., 2009). We periodically check the reliability of diffusion data by using the National Institutes of Standards and Technology diffusion phantom to ensure that the diffusion measurements from diffusion MRI are stable(phantom)

Supplemental Method 2: Mixed-effects linear regression models and empirical bayes estimation

The main multiple mixed-effects regression models can be summarized as follows:

Multi-level models vs. Composite models

| | | |
|---------|---|--|
| Eq. | $\pi_{0i} = \gamma_{00} + \gamma_{0a}X_{aij} + \sum_{k=1}^l \gamma_{0k}Z_{ik} + \zeta_{0i}$ | $Y_{ij} = \gamma_{00} + \gamma_{0a}X_{aij} + \sum_{k=1}^l \gamma_{0k}Z_{ik}$ |
| 1.1-1.4 | $Y_{ij} = \pi_{0i} + \pi_{1i}Time_{ij} + \varepsilon_{ij}$ | $+ \gamma_{10}Time_{ij} + \gamma_{1a}X_{aij}Time_{ij}$ |
| | $\pi_{1i} = \gamma_{10} + \gamma_{1a}X_{aij} + \sum_{m=1}^n \gamma_{1m}Z_{im} + \zeta_{1i}$ | $+ \sum_{m=1}^n \gamma_{1m}Z_{im}Time_{ij}$ |
| | | $+ (\zeta_{0i} + \zeta_{1i}Time_{ij} + \varepsilon_{ij})$ |

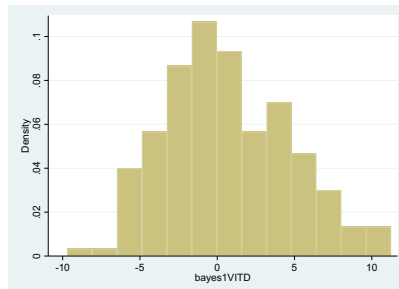
Where Y_{ij} is the outcome (25(OH)D, Folate and B-12) for each individual “i” and visit “j”; π_{0i} is the level-1 intercept for individual i; π_{1i} is the level-1 slope for individual i; γ_{00} is the level-2 intercept of the random intercept π_{0i} ; γ_{10} is the level-2 intercept of the slope π_{1i} ; Z_{ik} is a vector of fixed covariates for each individual i that are used to predict level-1 intercepts and slopes and included baseline age (Age_{base}) among other covariates. X_{ija} , represents the main predictor variables. In this case, all predictor variables were socio-demographic and used for prediction. ζ_{0i} and ζ_{1i} are level-2 disturbances; ε_{ij} is the within-person level-1 disturbance. Main effect of $TIME$ (γ_{1a}) and interactions with socio-demographic factors (γ_{1a}) along with random effects ζ_{1i} were used to estimate each individual slope π_{1i} , also known as the empirical bayes estimator. The time interval model is described in details in this methodological paper.(Blackwell et al., 2006) Since time is measured as year elapsed since visit 1 up till visit 2, the interpretation of π_{1i} is the predicted individual-level annual rate of change in the outcome Y_{ij} , between visits 1 and 2. This empirical bayes estimator of slope was used to examine association between annual rates of change in each of the 3 vitamins vs. brain MRI markers. Below are the results of the mixed effects regression models for each of the 3 vitamin markers:

| | 25(OH)D | Folate | B-12 |
|---|------------------|--------------------|------------------------|
| | (n=2,783, k=1.5) | (n=3,014, k=1.7) | (N=3,014, k=1.7) |
| Intercept ($\gamma_{00} \pm SE$) | 24.42 \pm 1.15 | 8.90 \pm 0.70 | 394.57 \pm 26.37 |
| Time ($\gamma_{10} \pm SE$) | -1.59 \pm 0.32 | 0.38 \pm 0.18 | -2.98 \pm 6.27 |
| Age(v_i) $\gamma_{01} \pm SE$ | 0.03 \pm 0.02 | 0.13 \pm 0.01 | 1.86 \pm 0.51 |
| Age(v_i) \times Time, $\gamma_{11} \pm SE$ | 0.04 \pm 0.01 | -0.002 \pm 0.003 | -0.06 \pm 0.12 |
| Sex (0=Female, 1=Male), $\gamma_{02} \pm SE$ | 0.95 \pm 0.41 | 0.18 \pm 0.25 | -21.64 \pm 9.39 |
| Sex \times Time, $\gamma_{12} \pm SE$ | -0.61 \pm 0.11 | -0.05 \pm 0.06 | -2.43 \pm 2.18 |
| Race (0=Whites, 1=AA), $\gamma_{03} \pm SE$ | -9.45 \pm 0.41 | -0.73 \pm 0.25 | 93.49 \pm 9.51 |
| Race \times Time, $\gamma_{13} \pm SE$ | 0.60 \pm 0.16 | -0.06 \pm 0.06 | -3.45 \pm 2.24 |
| Poverty (0=Below, 1=Above), $\gamma_{04} \pm SE$ | -2.93 \pm 0.41 | -0.95 \pm 0.26 | -15.85 \pm 9.59 |
| Poverty \times Time, $\gamma_{14} \pm SE$ | 0.23 \pm 1.15 | -0.03 \pm 0.06 | -1.47 \pm 2.21 |
| Var (ζ_{0i}) | 1.04 \pm 0.46 | 0.06 \pm 0.20 | 1097.69 \pm 207.70 |
| Var (ζ_{1i}) | 32.13 \pm 5.61 | 19.28 \pm 2.57 | 45249.04 \pm 2673.22 |
| Var (\mathcal{E}_{ij}) | 52.60 \pm 5.13 | 23.82 \pm 2.35 | 15641.81 \pm 2181.60 |

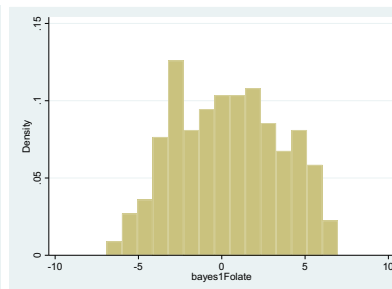
Below are distributional graphs for each of the 3 empirical Bayes estimators of the slope, which are estimated as follows:

$$\gamma_{10} + \gamma_{11} \times \text{Age} + \gamma_{12} \times \text{Sex} + \gamma_{13} \times \text{Race} + \gamma_{14} \times \text{Poverty} + \zeta_{1i}$$

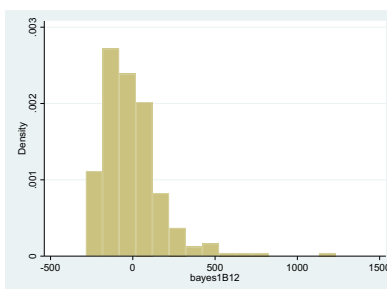
Vitamin D annual rate of change



Folate annual rate of change

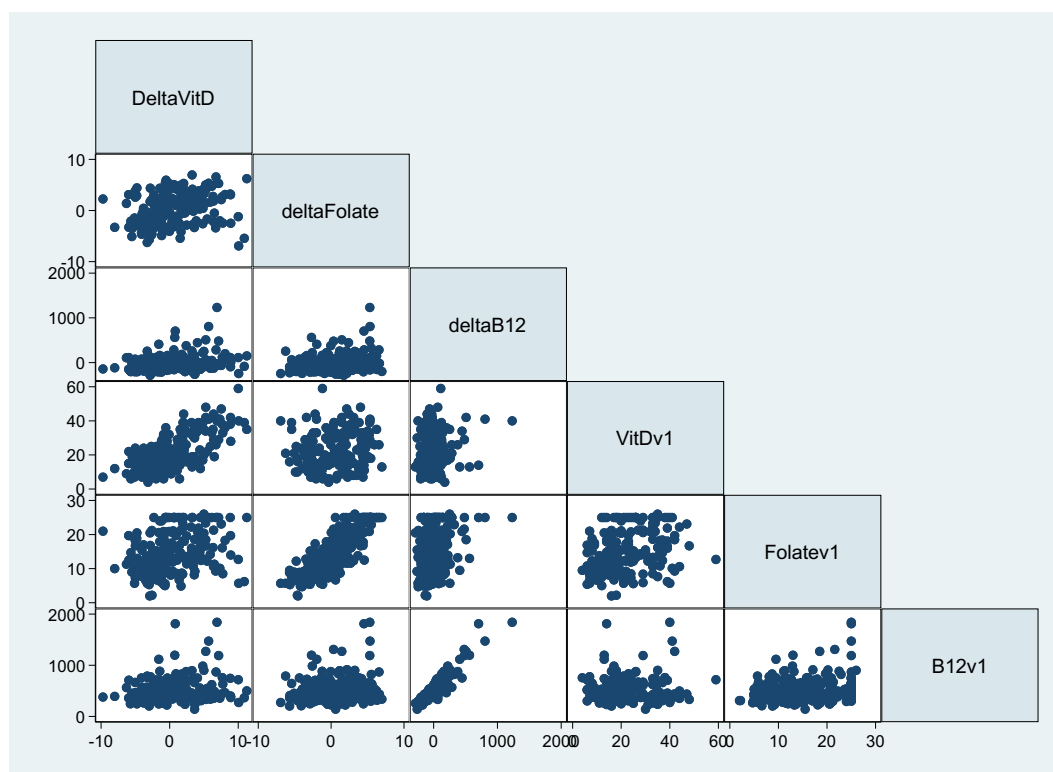


Cobalamin annual rate of change



Below is a scatter plot of the empirical Bayes estimators against visit 1 values. Due to high correlation between each pair ($r=0.65-0.93$), only empirical estimators will be entered into the final model along with potential confounders, to reduce risk of collinearity.

Baseline and annual rates of change in 3 serum vitamins: scatterplot matrix



Abbreviations: B12v1=serum cobalamin at visit 1; deltaB12=Empirical bayes estimator of annual rate of change in serum cobalamin; deltaFolate=Empirical bayes estimator of annual rate of change in serum folate; deltaVitD=Empirical bayes estimator of annual rate of change in 25(OH)D; Folatev1=serum folate at visit 1; VitDv1=serum 25(OH)D at visit 1.

Supplemental Method 3: Additional covariates, LASSO regression and multiple imputations

A. Additional covariates:

A.1. Socio-demographic

Additional socio-demographic confounders included educational attainment (0≤High School (HS); 1=HS and 2≥HS), the Wide Range Achievement Test (WRAT) letter and word reading subtotal scores to measure literacy and marital status (1=married, 0=not married) (Beydoun et al., 2018).

A.2. Lifestyle

Smoking and drug use

Current use of opiate, marijuana or cocaine use (“current” vs. “never or former”) and smoking status (“current” vs. “never or former”) were considered.

Adiposity measures

Measured body mass index (BMI, kg/m²), waist circumference and waist-hip-ratio were considered among potential confounders.

Healthy Eating Index 2010-

The Healthy Eating Index (HEI-2010) total score, based on two 24-hr recalls administered at baseline, was used as a measure of overall dietary quality. See steps for calculating HEI-2010 at <http://appliedresearch.cancer.gov/tools/hei/tools.html> and <http://handls.nih.gov/06Coll-dataDoc.html>.

Dietary Approaches to Stop Hypertension (DASH)

The score for DASH diet adherence, based on 8 nutrients, was determined for each participant using the formula reported by Mellen *et al.* (Mellen et al.). The nine target nutrients were total fat, saturated fat, protein, fiber, cholesterol, sodium, calcium, magnesium, and potassium. Micronutrient goals were expressed per 1000 kcal. The total DASH score was generated by the sum of all nutrient targets met. If the participant achieved the DASH target for a nutrient, a value of 1 was assigned, and if the intermediate target for a nutrient was achieved, a value of 0.5 was assigned. A value of zero was assigned if neither target was met. The maximum DASH score was 9; individuals meeting approximately half of the DASH targets (DASH score = 4.5) were considered DASH adherent (Mellen et al.).

Mean Adequacy Ratio (MAR)

Diet quality was also assessed using Nutrient Adequacy Ratio (NAR) and Mean Adequacy Ratio (MAR) scores (Murphy et al., 2006; Fanelli Kuczmarski et al., 2013). The NAR score was determined by taking each participant's daily intake of a nutrient divided by the Recommended Dietary Allowance (RDA) for that nutrient. NAR scores were determined for 17 micronutrients: vitamins A, C, D, E, B₆, B₁₂, folate, iron, thiamin, riboflavin, niacin, copper, zinc, calcium, magnesium, phosphorus, and selenium. The RDA was adjusted for participants' ages and sexes and vitamin C was adjusted for smokers (Murakami et al., 2019). The NAR score was converted into a percent with values exceeding 100 truncated to 100. MAR scores were calculated by averaging the NAR scores: $MAR = (\sum NAR \text{ scores}) / 17$ (Fanelli Kuczmarski et al., 2018). NAR and MAR were calculated separately for each daily-intake and then averaged. MAR scores, based on food intakes only, were used as the nutrient-based diet quality variable.

Supplemental use

The HANDLS dietary supplement questionnaire was adapted from the 2007 NHANES instrument.(Centers for Disease Control and Prevention, 2007) HANDLS participants provided supplement bottles during their dietary interview at the follow-up visit only (i.e. visit 2). Information on Over-The-Counter (OTC) vitamin and mineral supplements, antacids, prescription supplements, and botanicals were reported, and supplement users were asked about dose strength, dose amount consumed, length of supplement use (converted to days), frequency of use (daily, monthly, seasonally, annually), and if each supplement was taken the day prior to interview(Beydoun et al., 2018).

A HANDLS dietary supplement database was developed by trained nutritionists and registered dietitians. This database consisted of 4 files integrated to generate daily intake of each nutrient consumed by a dietary supplement user. [See detailed description at the HANDLS study website: <https://handls.nih.gov/>].

Depressive symptoms

Depressive symptoms were operationalized using the CES-D, at both baseline and follow-up. The 20-item CES-D is a self-reported symptom rating scale assessing affective and depressed mood.(Radloff, 1977) A score of ≥ 16 on the CES-D is reflective of elevated depressive symptoms (EDS), (Ramos et al., 2004) and predicts clinical depression based on the Diagnostic and Statistical Manual, fourth edition (DSM-IV) criteria.(Myers and Weissman, 1980) Four CES-D sub-domains exhibiting an invariant factor structure between The National Health and Nutrition Examination Survey I and pilot HANDLS data (Nguyen et al., 2004) were computed. We tested our hypotheses using total and domain-specific CES-D scores: **(1)** Somatic complaints; **(2)** Depressive affect; **(3)** Positive affect and **(4)** Interpersonal problems.(Nguyen et al., 2004)

A.3. Health-related

Baseline chronic conditions included self-reported history and biomarker-based measurement (as well as medication-based) of type 2 diabetes, hypertension, dyslipidemia, cardiovascular disease and inflammatory disease. Dyslipidemia was based on a combination of self-report, HDL, total cholesterol, triglyceride criteria as well as statin use. Similarly, type 2 diabetes was determined using a combination of self-report, serum glucose criteria and medication, as was the case for hypertension. In addition, a composite of cardiovascular disease history was added in which self-reported stroke, congestive heart failure, non-fatal myocardial infarction or atrial fibrillation were considered and combined into a yes/no variable. Similarly, inflammatory disease was a binary composite of multiple sclerosis, systemic lupus, gout, rheumatoid arthritis, psoriasis, Thyroid disorder and Crohn's disease. The use of NSAIDs (NSAIDs, prescription and over-the-counter) over the past two weeks as well as use of statins were considered separately as potential covariates.

A.4. Other biomarkers

All laboratory tests selected for this study were done at Quest Diagnostics, Chantilly, VA.

Serum cholesterol and atherogenic indices

Total cholesterol (TC), High density lipoprotein-cholesterol (HDL-C) and Triacylglycerols (TA) were assessed using a spectrophotometer (Olympus 5400). Low density lipoprotein-cholesterol (LDL-C) was calculated as $TC - (HDL-C + TA/5)$ and directly measured in a sub-sample (N=236) also using a spectrophotometer (Olympus 5400). The correlation between those with baseline calculated LDL-C and those with measured LDL-C was $r=0.95$. From these measures, two relative measures were obtained, namely TC:HDL-C and LDL-C:HDL-C ratios. Those two relative measures, also termed "atherogenic indices" were previously studied in relation to various cardiovascular outcomes and were found to be positively associated with measures of atherosclerosis and coronary heart disease. (Nair et al., 2009;Manickam et al., 2011;Hisamatsu et al., 2014)

Serum uric acid (SUA)

SUA measurements are useful in the diagnosis and treatment of renal and metabolic disorders, including renal failure, gout, leukemia, psoriasis, starvation or other wasting conditions, and in patients receiving cytotoxic drugs. Using 1 ml of fasting blood serum, uric acid was measured using a standard spectrophotometry method. The reference range for adult men is 4.0-8.0 mg/dL, whereas for women, this range is cited as 2.5-7.0 mg/dL.

(<http://www.questdiagnostics.com/testcenter/TestDetail.action?ntc=905>) Other reference ranges were also recently suggested and depend on the menopausal status of women. Those reference ranges are based on predictive value for gout outcomes among healthy individuals and do not necessarily predict other pathologies. Thus, based on recent research evidence, a “normal” SUA value is suggested to be <6.0 mg/dL for all healthy adult individuals.

Serum albumin

Using 0.5-1 mL sample of plasma prepared with heparin and refrigerated for up to 30 days, albumin was measured with spectrophotometry, with an expected reference range of 3.6-5.1 g/dL (Beydoun et al., 2016b; Beydoun et al., 2019).

High sensitivity C-reactive protein (CRP)

High sensitivity CRP (hs-CRP) was analyzed with an immunoturbidimeter (Siemens/Behring Nephelometer II), using 0.5-1 mL of plasma, with the range 1-10 mg/dL indicating average or high cardiovascular risk and >10 mg/dL suggestive of an infection or a chronic inflammation.

Serum creatinine

Using participant fasting venous blood specimens, baseline serum creatinine was measured at the National Institute on Aging, Clinical Research Branch Core Laboratory, using a modified kinetic Jaffe method (CREA method, Dade Dimension X-Pand Clinical Chemistry System, Siemens Healthcare Diagnostics Inc., Newark, DE) for a small group of participants (n=88); while the majority of participants (n=1,528) had baseline serum creatinine analyzed at Quest Diagnostics, Inc. by isotope dilution mass spectrometry (IDMS) (Olympus America Inc., Melville, NY) and standardized to the reference laboratory, Cleveland Clinic. While inter-assay coefficients of variation (CV) for this sample could not be calculated due to the use of only one or the other measurement of creatinine at baseline, only intra-assay CVs (mean/SD) could be estimated and those were 0.192 and 0.187 for the CREA and the IDMS methods, respectively.

HbA1c

Glycated hemoglobin is derived from the nonenzymatic addition of glucose to amino groups of hemoglobin. HbA1c is a specific glycated hemoglobin that results from the attachment of glucose to the N-terminal valine of the hemoglobin b-chain. Numerous assays were subsequently developed to measure glycated hemoglobins. The principle of all methods is to separate the glycated and nonglycated forms of hemoglobin (Beydoun et al., 2016a). This can be accomplished based on differences in charge (usually by HPLC) or structure (usually immunoassays or boronate affinity chromatography). In this study, the method adopted was HPLC (Quest diagnostics).

White blood cell inflammatory markers

Fasting blood samples were collected from participants at baseline and follow-up to determine total white blood cell count, (K/mm³), using electronic Cell Sizing, counting, cytometry and microscopy. (<http://www.questdiagnostics.com/testcenter/TestDetail.action?ntc=7064>).

Red cell distribution width (RDW), hemoglobin and other iron status measures

RDW

RDW was measured by automated Coulter DXH 800 hematology analyzer as part of peripheral complete blood count (Beckman Coulter, Brea, CA), and was expressed as coefficient of variation (%) of red blood cell volume distribution. Regular calibration was performed every 3 months on the hematology analyzer and quality control was performed according to the manufacturer’s recommendations. (Diagnostics) There are usually two RDW measurements used for clinical purposes, namely the RDW-coefficient of variation (CV, unit: %), which we used in this study, and the RDW-Standard Deviation (SD, unit: fL) from which RDW-CV is derived. In fact, $RDW-CV = RDW-SD \times 100 / MCV$, where MCV is the mean cell volume. The normal range for RDW-CV is 11.0 - 15.0%.

Thus, the RDW-CV (%) depends on both the width of the distribution (normal range: 40-55 fL) curve and the MCV.(techs, 2019)

Hemoglobin (Hb)

Similarly, using electronic cell sizing/cytometry/microscopy, Hb was assayed from a sample of 1 ml of blood drawn from participants after overnight fast, and refrigerated up to 6 days (Quest diagnostics).

Other iron status markers

Ferritin: Ferritin is decreased in iron deficiency anemia and increase in iron overload. It is measured with immunoassay with reference ranges of 20-380 ng/mL among men and 10-232 ng/mL among women.(Diagnostics)

Erythrocyte Sedimentation Rate (ESR): Using 5 mL of refrigerated whole blood stored in lavender-top EDTA tubes, the ESR was tested within 24 hr of blood draw. This test used automated modified Westergren photochemical capillary stopped flow kinetic analysis.(Diagnostics;Larsson and Hansson, 2004) The Mayo clinic reports a reference of 0-22 mm/hr for men and 0-29 mm/hr for women(Mayo Clinic, 2017) and is considered a proxy measure for serum fibrinogen.(Yin et al., 2017)

Serum iron: 0.5-1 mL of fasting serum was collected, transported at room temperature (with heparin added) and refrigerated or frozen subsequently. Serum iron was measured with spectrophotometry, (Diagnostics;Samarina and Proskurnin, 2015) with reference ranges for men aged ≥ 30 y set at 50-180 $\mu\text{g/dL}$ and for women: 20-49y (40-190 $\mu\text{g/dL}$) and 50+y(45-160 $\mu\text{g/dL}$). (Diagnostics)

MCV: Also known as erythrocyte mean corpuscular volume, MCV is measured using standard electronic cell sizing/counting/cytometry/microscopy. Similar to other hemogram measures (e.g. ESR), a microtainer 1 mL whole blood in an EDTA (lavender-top) tube was transported at room temperature to the laboratory facility.(Diagnostics)

MCH: The hematologic index MCH was calculated as follows: $\text{MCH} = \text{Hb/RBC}$.

B. Least absolute shrinkage and selection operator (LASSO) regression procedure

In order to select the appropriate set of predictive model for each of the 3 vitamins, we used statistical learning method for variable selection known as adaptive LASSO, and compared it to cross-validation LASSO (cvLASSO) and lowest BIC LASSO. Socio-demographic variables, namely age, sex, race/ethnicity, poverty status were force entered in all models as fixed terms. The LASSO then selected among the other covariates listed above, the ones that should be retained. Covariates were imputed using chained equations (5 imputations, 10 iterations), accounting for their level of measurement. Socio-demographic factors were entered into all the chained equations. Continuous covariates were entered as outcomes in a series of linear regression models, while binary and categorical variables were entered into a series of multinomial logit regression models.

LASSO is a covariate selection methodology that is superior to both generalized linear models without covariate selection and the usually applied stepwise or backward elimination process.(Zou, 2006) In fact, stepwise selection is often trapped into a local optimal solution rather than the global optimal solution and backward elimination can be

time-consuming given the large number of variables in the full model.(Zou, 2006) These methods often ignore stochastic errors or uncertainty incurred during variable selection, with the LASSO estimate being defined as follows:

$$\beta(\text{lasso}) = \arg \min_{\beta} \|y - \sum_{j=1}^p x_j \beta_j\|^2 + \lambda \sum_{j=1}^p |\beta_j|$$

with λ being a nonnegative regularization parameter.(Zou, 2006) The second term of the equation termed the “l1 penalty” is a key portion of this equation ensuring the success of the lasso method of covariate selection. In fact, this method was shown to discover the right sparse representation of the model, given certain conditions. Nevertheless, this method can produce biased estimates for larger coefficients. Thus, there a number of scenarios whereby the LASSO can yield inconsistent results. More recently, several related methods have been developed and validated against each other. It was shown that an adaptive version of the LASSO gave more consistent findings, particularly when compared with another popular variable selection technique known as the nonnegative garotte.

In our modeling approach, we used this convex optimization technique with l_1 constraint known as adaptive LASSO as one of three methods to select the final linear regression models. The model is trained on a random half sample of the total population (first imputation out of 5) and validated against the other half sample to check robustness of findings, by comparing R^2 between samples. One model was selected among the cvLASSO, adaptive LASSO or minBIC LASSO, depending on how close the R^2 are between half-samples. This parsimonious model selected for each of 3 vitamins (measured at v_1 and empirical Bayes slope estimator measured between v_1 and v_2) as 6 potential outcomes is then run on the entire population and a backward elimination process is carried out to keep only significant covariates at type I error of 0.10. Thus, the selected model through LASSO was used as a starting point for further backward elimination. Backward elimination was conducted on the imputed data for the entire sample, rather than the half sample for the first imputation.

In our analysis, the following LASSO models were selected and the final model included is shown also in this Table.

| Selected covariates¹ | | | | |
|--|--|--|--|--|
| | cvLASSO | Min BIC LASSO | Adaptive LASSO | Reduced model |
| Vitamin D (v1) | Sex, race, pir, age, B12, Folate, BMI, Cholesterol, ESR, MCV, Iron, Triglycerides, MAR, Albumin, education, Uric acid, MCH, NSAIDs, statins, Diabetes, WBC, CVD, HDL, RDW, education, current drug use, creatinine, DASH, Ferritin | Sex, race, pir, age B12, Folate, BMI, Cholesterol, MCV, MAR, Albumin | Sex, race, pir, age, B12, Folate, BMI, Cholesterol, ESR, MCV, Iron, Triglycerides, MAR, Albumin, education, Uric acid, NSAIDs, statins, Diabetes, WBC, CVD | Sex, race, pir, age, B12, Folate, BMI, MCV, Albumin |
| Folate (v1) | Age, sex, pir, race, B12, Vitamin D, MAR, Ferritin, iron, smoking, MCH, education, DASH, diagnosed diabetes, Albumin, CES-D, diagnosed hypertension, cholesterol, CRP, Hemoglobin, HbA1c, | Age, sex, pir, race, B12, Vitamin D, MAR, Ferritin, iron, smoking, MCH, education, DASH, Diabetes, Albumin, CES-D, hypertension, cholesterol, CRP, Hemoglobin, HbA1c, diagnosed | Age, sex, pir, race, B12, Vitamin D, MAR, Ferritin, iron, smoking, MCH, education, DASH, Diabetes, Albumin, CES- D, hypertension, cholesterol, CRP, Hemoglobin, HbA1c, diagnosed dyslipidemia, RDW, NSAIDs. | Age, sex, pir, race, B12, Vitamin D, MAR, Ferritin, iron, smoking, DASH, Albumin, Hemoglobin, RDW |

| | | | | |
|--------------------------|--|---|---|--|
| | diagnosed dyslipidemia, RDW, NSAIDs, married. | dyslipidemia, RDW, NSAIDs, married. | | |
| B-12 (v1) | Age, sex, race, pir, vitamin D, Folate, vitamin supplement use, HEI-2010, Ferritin, RDW, ESR, Triglycerides, MCH, Cholesterol, married albumin. | Age, sex, race, pir, vitamin D, Folate, vitamin supplement use, HEI-2010, RDW. | Age, sex, race, pir, vitamin D, Folate, vitamin supplement use, HEI-2010, Ferritin, RDW, ESR, Triglycerides, MCH, Cholesterol. | Age, sex, race, pir, vitamin D, Folate, vitamin supplement use, HEI-2010, RDW. |
| Vitamin D (slope) | Age, sex, pir, race, BMI, Cholesterol, Folate, HDL, vitamin supplement use, MCV, Chol:HDL ratio, Albumin, diagnosed dyslipidemia, DASH, Uric acid, CVD, education, iron, MAR, HEI-2010, Triglycerides, ESR, Diabetes, WBC, NSAIDs, Hypertension, Creatinine, CES-D, WHR, MCH, inflammatory conditions, smoking, Waist circumference, current drug use, Ferritin, married. | Age, sex, pir, race B12, BMI, Folate, vitamin supplement use, MCV, Albumin | Age, sex, pir, race, BMI, Cholesterol, Folate, HDL, vitamin supplement use, MCV, Chol:HDL ratio, Albumin, diagnosed dyslipidemia, DASH, Uric acid, CVD, education, iron, MAR, HEI-2010, Triglycerides, ESR, Diabetes, WBC, NSAIDs, Hypertension, Creatinine, CES-D, WHR. | Age, sex, pir, race, B12, BMI, Folate, vitamin supplement use, Albumin |
| Folate (slope) | Vitamin D, B12, Iron, vitamin supplement use, MAR, Albumin, Hemoglobin, MCH, DASH, smoking, Diabetes, education, HbA1c, WRAT total score, Dyslipidemia, Hypertension, CES- D, current drug use, NSAIDs | Vitamin D, B12, Iron, vitamin supplement use, MAR, Albumin, DASH, smoking, education | Vitamin D, B12, Iron, vitamin supplement use, Ferritin, MAR, Albumin Hemoglobin, MCH, DASH, smoking, Diabetes, education, HbA1c. | Age, sex, pir, race, vitamin D, B12, Iron, vitamin supplement use, Ferritin, MAR, Albumin Hemoglobin, DASH, smoking |
| B-12 (slope) | Age, sex, race, pir, Vitamin D, Folate, vitamin supplement use, HEI-2010, Triglycerides, Ferritin, ESR, RDW | Age, sex, race, pir, Vitamin D, Folate, vitamin supplement, HEI- 2010, Triglycerides. | Age, sex, race, pir, Vitamin D, Folate, vitamin supplement, HEI-2010, Triglycerides, Ferritin, ESR, RDW | Age, sex, race, pir, Vitamin D, Folate, vitamin supplement use, HEI-2010, Ferritin, ESR, RDW |

Abbreviations: B-12=vitamin B-12 (cobalamin); BIC=Bayesian information criterion; BMI=Body Mass Index; CES-D=Center for Epidemiologic Studies-Depression; CRP=C-reactive Protein; cv=cross-validation; CVD=Self-reported cardiovascular disease; DASH=Dietary Approaches to

Stop Hypertension; ESR=Erythrocyte Sedimentation Rate; HbA1c=Glycated hemoglobin; HDL=High Density Lipoprotein Cholesterol;
 LASSO= Least absolute shrinkage and selection operator; HEI-2010=Healthy Eating Index, 2010 revision; MAR=Mean Adequacy Ratio;
 MCH=Mean cell hemoglobin; MCV=Mean Cell Volume; NSAIDS=Non-Steroidal Anti-inflammatory Drugs; RDW=Red cell distribution
 Width; WBC=White Blood Cells; WHR=Waist-Hip-Ratio

¹Bolded sets of covariates are the ones that are selected at each step of the model selection process. A full row of bolded sets of covariates indicates that the selection process is equivalent and that backward elimination did not reduce the model further.

Supplemental Table 1: BRAIN ATLAS NOMENCLATURE FOR sMRI data^{1,2,3}

| ROI_IND EX | NUM_V OX | TISSUE_S EG | HEMISP HERE | SUBGROU P_0 | SUBGROUP_ 1 | SUBGROUP_2 | ROI_NAM E |
|---------------|-------------|----------------|----------------|----------------|-------------------|------------|--|
| 95 | 12872 | WM | B | CC | | | corpus callosum |
| 71 | 4899.8 | GM | B | CEREBELL UM | | | Cerebellar Vermal Lobules I-V |
| 73 | 2858.8 | GM | B | | | | Cerebellar Vermal Lobules VIII-X |
| 72 | 2266.9 | GM | B | | | | Cerebellar Vermal Lobules VI- VII |
| 39 | 54583 | GM | L | | | | Left Cerebellum Exterior |
| 41 | 15501 | WM | L | | | | Left Cerebellum White Matter |
| 38 | 54379 | GM | R | | | | Right Cerebellum Exterior |
| 40 | 15459 | WM | R | | | | Right Cerebellum White Matter |
| | | | | | | | |
| 30 | 585.9 | GM | L | DEEP_WM _GM | BASAL_GAN GLIA | | Left Accumbens Area |
| 37 | 3578.9 | GM | L | | | | Left Caudate |
| 56 | 1597.6 | GM | L | | | | Left Pallidum |
| 58 | 4942.3 | GM | L | | | | Left Putamen |
| 23 | 526 | GM | R | | | | Right Accumbens Area |
| 36 | 3651.5 | GM | R | | | | Right Caudate |
| 55 | 1638.8 | GM | R | | | | Right Pallidum |
| 57 | 4726 | GM | R | | | | Right Putamen |
| 60 | 8574.1 | GM | L | | DEEP_GM | | Left Thalamus Proper |
| 59 | 8256.3 | GM | R | | | | Right Thalamus Proper |
| 92 | 2887.7 | WM | L | | DEEP_WM | | anterior limb of internal capsule left |

| | | | | | | | |
|-----|--------|----|---|---------|-------------|---------------------|---|
| 91 | 3393.3 | WM | R | | | | anterior limb of internal capsule right |
| 90 | 673.6 | WM | L | | | | fornix left |
| 89 | 517.5 | WM | R | | | | fornix right |
| 94 | 2416.3 | WM | L | | | | posterior limb of internal capsule inc. cerebral peduncle left |
| 93 | 2480.5 | WM | R | | | | posterior limb of internal capsule inc. cerebral peduncle right |
| 32 | 993.7 | GM | L | | | | Left Amygdala |
| 75 | 586.5 | GM | L | | | | Left Basal Forebrain |
| 48 | 3597.7 | GM | L | | | | Left Hippocampus |
| 31 | 1021.3 | GM | R | | | | Right Amygdala |
| 76 | 593.1 | GM | R | | | | Right Basal Forebrain |
| 47 | 3704.7 | GM | R | | | | Right Hippocampus |
| 105 | 1897.7 | GM | L | FRONTAL | FRONTAL_G M | FRONTAL_INFERIOR_GM | Left AOrG anterior orbital gyrus |
| 137 | 3015.9 | GM | L | | | | Left LOrG lateral orbital gyrus |
| 147 | 4637.3 | GM | L | | | | Left MOrG medial orbital gyrus |
| 179 | 2915.7 | GM | L | | | | Left POrG posterior orbital gyrus |
| 104 | 2244.9 | GM | R | | | | Right AOrG anterior orbital gyrus |
| 136 | 2864.1 | GM | R | | | | Right LOrG lateral orbital gyrus |
| 146 | 4526.7 | GM | | | | | Right MOrG medial orbital gyrus |
| 178 | 2504.8 | GM | R | | | | Right POrG posterior orbital gyrus |
| 103 | 4749.1 | GM | L | | | FRONTAL_INSULAR_GM | Left AIns anterior insula |
| 173 | 2479.5 | GM | L | | | | Left PIns posterior insula |
| 102 | 4600.1 | GM | R | | | | Right AIns anterior insula |
| 172 | 2532 | GM | R | | | | Right PIns posterior insula |

| | | | | | |
|-----|--------|----|---|--------------------|---|
| 121 | 4392.8 | GM | L | FRONTAL_LATERAL_GM | Left FRP frontal pole |
| 143 | 22847 | GM | L | | Left MFG middle frontal gyrus |
| 163 | 3747 | GM | L | | Left OpIFG opercular part of the inferior frontal gyrus |
| 165 | 1901.2 | GM | L | | Left OriFG orbital part of the inferior frontal gyrus |
| 183 | 14665 | GM | L | | Left PrG precentral gyrus |
| 191 | 16867 | GM | L | | Left SFG superior frontal gyrus |
| 205 | 5256.2 | GM | L | | Left TrIFG triangular part of the inferior frontal gyrus |
| 120 | 4673.7 | GM | R | | Right FRP frontal pole |
| 142 | 22580 | GM | R | | Right MFG middle frontal gyrus |
| 162 | 4094.1 | GM | R | | Right OpIFG opercular part of the inferior frontal gyrus |
| 164 | 1944.4 | GM | R | | Right OriFG orbital part of the inferior frontal gyrus |
| 182 | 14641 | GM | R | | Right PrG precentral gyrus |
| 190 | 16697 | GM | R | | Right SFG superior frontal gyrus |
| 204 | 4522.4 | GM | R | | Right TrIFG triangular part of the inferior frontal gyrus |
| 125 | 2920.3 | GM | L | FRONTAL_MEDIAL_GM | Left GRE gyrus rectus |
| 141 | 2245.2 | GM | L | | Left MFC medial frontal cortex |
| 151 | 3081.3 | GM | L | | Left MPrG precentral gyrus medial segment |
| 153 | 8737 | GM | L | | Left MSFG superior frontal gyrus medial segment |

| | | | | | | | |
|-----|--------|----|---|--------|----------------|--------------------------|--|
| 187 | 1220.8 | GM | L | | | | Left SCA subcallosal area |
| 193 | 6723.3 | GM | L | | | | Left SMC supplementary motor cortex |
| 124 | 2699.9 | GM | R | | | | Right GRe gyrus rectus |
| 140 | 2202.6 | GM | R | | | | Right MFC medial frontal cortex |
| 150 | 2944.5 | GM | R | | | | Right MPrG precentral gyrus medial segment |
| 152 | 9415.8 | GM | R | | | | Right MSFG superior frontal gyrus medial segment |
| 186 | 1236 | GM | R | | | | Right SCA subcallosal area |
| 192 | 6368.8 | GM | R | | | | Right SMC supplementary motor cortex |
| 113 | 4466.1 | GM | L | | | FRONTAL_OPERCULAR_G M | Left CO central operculum |
| 119 | 2489.9 | GM | L | | | | Left FO frontal operculum |
| 175 | 2768.9 | GM | L | | | | Left PO parietal operculum |
| 112 | 4691.3 | GM | R | | | | Right CO central operculum |
| 118 | 2548.3 | GM | R | | | | Right FO frontal operculum |
| 174 | 2414.5 | GM | R | | | | Right PO parietal operculum |
| 82 | 91872 | WM | L | | FRONTAL_W M | | frontal lobe WM left |
| 81 | 95088 | WM | R | | | | frontal lobe WM right |
| 101 | 5262.2 | GM | L | LIMBIC | LIMBIC_GM | LIMBIC_CINGULATE_GM | Left ACgG anterior cingulate gyrus |
| 139 | 5335.1 | GM | L | | | | Left MCgG middle cingulate gyrus |
| 167 | 5181.6 | GM | L | | | | Left PCgG posterior cingulate gyrus |
| 100 | 4782.3 | GM | R | | | | Right ACgG anterior cingulate gyrus |

| | | | | | | | |
|-----|--------|----|---|-----------|--------------|--------------------------|--------------------------------------|
| 138 | 5475.1 | GM | R | OCCIPITAL | OCCIPITAL_GM | LIMBIC_MEDIALTEMPORAL_GM | Right MCgG middle cingulate gyrus |
| 166 | 4324.3 | GM | R | | | | Right PCgG posterior cingulate gyrus |
| 117 | 1887.4 | GM | L | | | | Left Ent entorhinal area |
| 171 | 3536.5 | GM | L | | | | Left PHG parahippocampal gyrus |
| 116 | 2120.6 | GM | R | | | | Right Ent entorhinal area |
| 170 | 3257.5 | GM | R | | | | Right PHG parahippocampal gyrus |
| 161 | 5087.5 | GM | L | | | OCCIPITAL_INFERIOR_GM | Left OFuG occipital fusiform gyrus |
| 160 | 4857.3 | GM | R | | | | Right OFuG occipital fusiform gyrus |
| 129 | 7403.4 | GM | L | | | OCCIPITAL_LATERAL_GM | Left IOG inferior occipital gyrus |
| 145 | 7232.9 | GM | L | | | | Left MOG middle occipital gyrus |
| 157 | 4297.6 | GM | L | | | | Left OCP occipital pole |
| 197 | 4152 | GM | L | | | | Left SOG superior occipital gyrus |
| 128 | 7633 | GM | R | | | | Right IOG inferior occipital gyrus |
| 144 | 6792.1 | GM | R | | | | Right MOG middle occipital gyrus |
| 156 | 4054.5 | GM | R | | | | Right OCP occipital pole |
| 196 | 4967 | GM | R | | | | Right SOG superior occipital gyrus |
| 109 | 3635.5 | GM | L | | | OCCIPITAL_MEDIAL_GM | Left Calc calcarine cortex |
| 115 | 5314.7 | GM | L | | | | Left Cun cuneus |
| 135 | 8386.3 | GM | L | | | | Left LiG lingual gyrus |
| 108 | 3543.7 | GM | R | | | | Right Calc calcarine cortex |

| | | | | | | | |
|-----|--------|----|---|--------------|------------------|----------------------|--|
| 114 | 5884.9 | GM | R | | | | Right Cun cuneus |
| 134 | 8366 | GM | R | | | | Right LiG lingual gyrus |
| 84 | 22742 | WM | L | | OCCIPITAL_ WM | | occipital lobe WM left |
| 83 | 22799 | WM | R | | | | occipital lobe WM right |
| 107 | 9939.4 | GM | L | PARIETAL | PARIETAL_G M | PARIETAL_LATERAL_GM | Left AnG angular gyrus |
| 177 | 13594 | GM | L | | | | Left PoG postcentral gyrus |
| 195 | 9984.3 | GM | L | | | | Left SMG supramargin al gyrus |
| 199 | 11733 | GM | L | | | | Left SPL superior parietal lobule |
| 106 | 11564 | GM | R | | | | Right AnG angular gyrus |
| 176 | 11681 | GM | R | | | | Right PoG postcentral gyrus |
| 194 | 9193 | GM | R | | | | Right SMG supramargin al gyrus |
| 198 | 11792 | GM | R | | | | Right SPL superior parietal lobule |
| 149 | 1400.3 | GM | L | | | PARIETAL_MEDIAL_GM | Left MPoG postcentral gyrus medial segment |
| 169 | 11737 | GM | L | | | | Left PCu precuneus |
| 148 | 1162.5 | GM | R | | | | Right MPoG postcentral gyrus medial segment |
| 168 | 11732 | GM | R | | | | Right PCu precuneus |
| 86 | 47237 | WM | L | | PARIETAL_W M | | parietal lobe WM left |
| 85 | 44217 | WM | R | | | | parietal lobe WM right |
| 123 | 8077.2 | GM | L | TEMPORA L | TEMPORAL_ GM | TEMPORAL_INFERIOR_GM | Left FuG fusiform gyrus |
| 122 | 8000.9 | GM | R | | | | Right FuG fusiform gyrus |
| 133 | 12612 | GM | L | | | TEMPORAL_LATERAL_GM | Left ITG inferior temporal gyrus |
| 155 | 15794 | GM | L | | | | Left MTG middle temporal gyrus |
| 201 | 8451.3 | GM | L | | | | Left STG superior |

| | | | | | | | |
|-----|--------|------|---|-----------|-------------|--|-------------------------------------|
| | | | | | | | temporal gyrus |
| 203 | 8632.1 | GM | L | | | | Left TMP temporal pole |
| 132 | 12693 | GM | R | | | | Right ITG inferior temporal gyrus |
| 154 | 16085 | GM | R | | | | Right MTG middle temporal gyrus |
| 200 | 9031.2 | GM | R | | | | Right STG superior temporal gyrus |
| 202 | 8883.7 | GM | R | | | | Right TMP temporal pole |
| 181 | 2629.8 | GM | L | | | | Left PP planum polare |
| 185 | 2511.3 | GM | L | | | | Left PT planum temporale |
| 207 | 1821.1 | GM | L | | | | Left TTG transverse temporal gyrus |
| 180 | 2448.5 | GM | R | | | | Right PP planum polare |
| 184 | 2325.5 | GM | R | | | | Right PT planum temporale |
| 206 | 1529.1 | GM | R | | | | Right TTG transverse temporal gyrus |
| 88 | 54535 | WM | L | | TEMPORAL_WM | | temporal lobe WM left |
| 87 | 55391 | WM | R | | | | temporal lobe WM right |
| 4 | 636.8 | VN | B | VENTRICLE | | | 3rd Ventricle |
| 11 | 1959.6 | VN | B | | | | 4th Ventricle |
| 50 | 304.9 | VN | L | | | | Left Inf Lat Vent |
| 52 | 7954.9 | VN | L | | | | Left Lateral Ventricle |
| 49 | 352.9 | VN | R | | | | Right Inf Lat Vent |
| 51 | 6629.5 | VN | R | | | | Right Lateral Ventricle |
| 35 | 18492 | NONE | B | | | | Brain Stem |
| 46 | 1011.6 | CSF | B | | | | CSF |
| 62 | 5192.8 | NONE | L | | | | Left Ventral DC |
| 64 | 36.5 | NONE | L | | | | Left vessel |
| 61 | 4998.9 | NONE | R | | | | Right Ventral DC |
| 63 | 33.3 | NONE | R | | | | Right vessel |

¹Shaded in light orange: Analysis A which consisted of TOTALBRAIN, WM and GM as alternative outcomes.

²Shaded in light green: Analysis B which consisted of GM//WM categorized by larger regions: OCCIPITAL, PARIETAL, TEMPORAL and FRONTAL. This analysis included R and L summed together for each large region.

³Shaded in light gray: Analysis C which consisted of all available smaller regions. Excluded regions due to missing data are the ones in the last column that are not highlighted in gray. Additional regions included: Optic chiasm, Lesion Volume.

Supplemental Table 2: Regions of Interest (ROI) used for dMRI measures: Fractional anisotropy (FA) and trace (TR)¹

| LEFT BRAIN | | | |
|------------|--------------|--|-------|
| 1 | SPG_L | Superior Parietal Gyrus Left | GM |
| 2 | CingG_L | Cingulate Gyrus Left | GM |
| 3 | SFG_L | Superior Frontal Gyrus Left | GM |
| 4 | MFG_L | Middle Frontal Gyrus Left | GM |
| 5 | IFG_L | Inferior Frontal Gyrus Left | GM |
| 6 | PrCG_L | Precentral Gyrus Left | GM |
| 7 | PoCG_L | Postcentral Gyrus Left | GM |
| 8 | AG_L | Angular Gyrus Left | GM |
| 9 | PrCu_L | Pre-Cuneus Left | GM |
| 10 | Cu_L | Cuneus Left | GM |
| 11 | LG_L | Lingual Gyrus Left | GM |
| 12 | Fu_L | Fusiform Gyrus Left | GM |
| 13 | PHG_L | Parahippocampal Gyrus Left | GM |
| 14 | SOG_L | Superior Occipital Gyrus Left | GM |
| 15 | IOG_L | Inferior Occipital Gyrus | GM |
| 16 | MOG_L | Middle Occipital Gyrus | GM |
| 17 | ENT_L | Entorhinal Area | GM |
| 18 | STG_L | Superior Temporal Gyrus | GM |
| 19 | ITG_L | Inferior Temporal Gyrus | GM |
| 20 | MTG_L | Middle Temporal Gyrus | GM |
| 21 | LFOG_L | Lateral Fronto-Orbital Gyrus | GM |
| 22 | MFOG_L | Middle Fronto-Orbital Gyrus | GM |
| 23 | SMG_L | Supramarginal Gyrus | GM |
| 24 | RG_L | Gyrus Rectus | GM |
| 25 | Ins_L | Insular | GM |
| 26 | Amyg_L | Amygdala | GM |
| 27 | Hippo_L | Hippocampus | GM |
| 28 | Cerebellum_L | Cerebellum | GM |
| 29 | CST_L | Corticospinal Tract Left | WM |
| 30 | ICP_L | Inferior Cerebellar Peduncle Left | WM |
| 31 | ML_L | Medial Lemniscus Left | WM/GM |
| 32 | SCP_L | Superior Cerebellar Peduncle Left | WM |
| 33 | CP_L | Cerebellar Peduncle Left | WM |
| 34 | ALIC_L | Anterior Limb of Internal Capsule Left | WM |

| | | | |
|----|------------|---|-------|
| 35 | PLIC_L | Posterior Limb of Internal Capsule Left | WM |
| 36 | PTR_L | Posterior Thalamic Radiation (Include Optic Radiation) Left | WM |
| 37 | ACR_L | Anterior Corona Radiata Left | WM |
| 38 | SCR_L | Superior Corona Radiata Left | WM |
| 39 | PCR_L | Posterior Corona Radiata Left | WM |
| 40 | CGC_L | Cingulum (Cingulate Gyrus) Left | WM |
| 41 | CGH_L | Cingulum (Hippocampus) Left | WM |
| 42 | Fx/ST_L | Fornix (Cres) / Stria Terminalis (Can Not Be Resolved With Current Resolution) Left | WM |
| 43 | SLF_L | Superior Longitudinal Fasciculus Left | WM |
| 44 | SFO_L | Superior Fronto-Occipital Fasciculus (Could Be A Part of Anterior Internal Capsule) Left | WM |
| 45 | IFO_L | Inferior Fronto-Occipital Fasciculus Left | WM |
| 46 | SS_L | Sagittal Stratum (Include Inferior Longitudinal Fasciculus And Inferior Fronto-Occipital Fasciculus) Left | WM |
| 47 | EC_L | External Capsule Left | WM |
| 48 | UNC_L | Uncinate Fasciculus Left | WM |
| 49 | PCT_L | Pontine Crossing Tract (A Part of Mcp) Left | WM |
| 50 | MCP_L | Middle Cerebellar Peduncle Left | WM |
| 51 | FX_L | Fornix (Column And Body of Fornix) Left | WM |
| 52 | GCC_L | Genu of Corpus Callosum Left | WM |
| 53 | BCC_L | Body of Corpus Callosum Left | WM |
| 54 | SCC_L | Splenium of Corpus Callosum Left | WM |
| 55 | RLIC_L | Retro-lenticular Part of Internal Capsule Left | WM |
| 56 | REDNC_L | Red Nucleus Left | GM |
| 57 | SNIGRA_L | Substantia Nigra Left | GM |
| 58 | TAP_L | Tapatum Left | GM |
| 59 | Caud_L | Caudate Nucleus Left | GM |
| 60 | Put_L | Putamen Left | GM |
| 61 | Thal_L | Thalamus Left | GM |
| 62 | GP_L | Globus Pallidus Left | GM |
| 63 | Midbrain_L | Midbrain Left | GM |
| 64 | Pons_L | Pons Left | WM |
| 65 | Medulla_L | Medulla Left | WM/GM |
| 66 | SPWM_L | Superior Parietal WM Left | WM |
| 67 | Cingwm | Cingulum WM Left | WM |
| 68 | SFWM_L | Superior Frontal WM Left | WM |
| 69 | MFWM_L | Middle Frontal WM Left | WM |
| 70 | IFWM_L | Inferior Frontal WM Left | WM |
| 71 | PrCWM_L | Precentral WM Left | WM |
| 72 | PoCWM_L | Postcentral WM Left | WM |
| 73 | AWM_L | Angular WM Left | WM |

| | | | |
|-------------|----------------|------------------------------------|----|
| 74 | PrCuWM_L | Pre-Cuneus WM Left | WM |
| 75 | CuWM_L | Cuneus WM Left | WM |
| 76 | LWM_L | Lingual WM Left | WM |
| 77 | Fu_WM_L | Fusiform WM Left | WM |
| 78 | SOWM_L | Superior Occipital WM Left | WM |
| 79 | IOWM_L | Inferior Occipital WM Left | WM |
| 80 | MOWM_L | Middle Occipital WM Left | WM |
| 81 | STwm_L | Superior Temporal WM Left | WM |
| 82 | ITWM_L | Inferior Temporal WM Left | WM |
| 83 | MTWM_L | Middle Temporal WM Left | WM |
| 84 | LFOWM_L | Lateral Fronto-Orbital WM Left | WM |
| 85 | MFOWM_L | Middle Fronto-Orbital WM Left | WM |
| 86 | SMWM_L | Supramarginal WM Left | WM |
| 87 | RGWM_L | Rectus WM Left | WM |
| 88 | Cerebellumwm_L | Cerebellum WM Left | WM |
| RIGHT BRAIN | | | |
| 89 | SPG_R | Superior Parietal Gyrus Right | GM |
| 90 | CingG_R | Cingulate Gyrus Right | GM |
| 91 | SFG_R | Superior Frontal Gyrus Right | GM |
| 92 | MFG_R | Middle Frontal Gyrus Right | GM |
| 93 | IFG_R | Inferior Frontal Gyrus Right | GM |
| 94 | PrCG_R | Precentral Gyrus Right | GM |
| 95 | PoCG_R | Postcentral Gyrus Right | GM |
| 96 | AG_R | Angular Gyrus Right | GM |
| 97 | PrCu_R | Pre-Cuneus Right | GM |
| 98 | Cu_R | Cuneus Right | GM |
| 99 | LG_R | Lingual Gyrus Right | GM |
| 100 | FuG_R | Fusiform Gyrus Right | GM |
| 101 | PHG_R | Parahippocampal Gyrus Right | GM |
| 102 | SOG_R | Superior Occipital Gyrus Right | GM |
| 103 | IOG_R | Inferior Occipital Gyrus Right | GM |
| 104 | MOG_R | Middle Occipital Gyrus Right | GM |
| 105 | ENT_R | Entorhinal Area Right | GM |
| 106 | STG_R | Superior Temporal Gyrus Right | GM |
| 107 | ITG_R | Inferior Temporal Gyrus Right | GM |
| 108 | MTG_R | Middle Temporal Gyrus Right | GM |
| 109 | LFOG_R | Lateral Fronto-Orbital Gyrus Right | GM |
| 110 | MFOG_R | Middle Fronto-Orbital Gyrus Right | GM |
| 111 | SMG_R | Supramarginal Gyrus Right | GM |
| 112 | RG_R | Gyrus Rectus Right | GM |
| 113 | Ins_R | Insular Right | GM |

| | | | |
|-----|--------------|--|-------|
| 114 | Amyg_R | Amygdala Right | GM |
| 115 | Hippo_R | Hippocampus Right | GM |
| 116 | Cerebellum_R | Cerebellum Right | GM |
| 117 | CST_R | Corticospinal Tract Right | WM |
| 118 | ICP_R | Inferior Cerebellar Peduncle Right | WM |
| 119 | ML_R | Medial Lemniscus Right | WM/GM |
| 120 | SCP_R | Superior Cerebellar Peduncle Right | WM |
| 121 | CP_R | Cerebellar peduncle, Right | |
| 122 | ALIC_R | Anterior Limb of Internal Capsule Right | WM |
| 123 | PLIC_R | Posterior Limb of Internal Capsule Right | WM |
| 124 | PTR_R | Posterior Thalamic Radiation (Include Optic Radiation) Right | WM |
| 125 | ACR_R | Anterior Corona Radiata Right | WM |
| 126 | SCR_R | Superior Corona Radiata Right | WM |
| 127 | PCR_R | Posterior Corona Radiata Right | WM |
| 128 | CGC_R | Cingulum (Cingulate Gyrus) Right | WM |
| 129 | CGH_R | Cingulum (Hippocampus) Right | WM |
| 130 | Fx/ST_R | Fornix (Cres) / Stria Terminalis (Can Not Be Resolved With Current Resolution) Right | WM |
| 131 | SLF_R | Superior Longitudinal Fasciculus Right | WM |
| 132 | SFO_R | Superior Fronto-Occipital Fasciculus (Could Be A Part of Anterior Internal Capsule) Right | WM |
| 133 | IFO_R | Inferior Fronto-Occipital Fasciculus Right | WM |
| 134 | SS_R | Sagittal Stratum (Include Inferior Longitudinal Fasciculus And Inferior Fronto-Occipital Fasciculus) Right | WM |
| 135 | EC_R | External Capsule Right | WM |
| 136 | UNC_R | Uncinate Fasciculus Right | WM |
| 137 | PCT_R | Pontine Crossing Tract (A Part of MCP) Right | WM |
| 138 | MCP_R | Middle Cerebellar Peduncle Right | WM |
| 139 | FX_R | Fornix (Column And Body of Fornix) Right | WM |
| 140 | GCC_R | Genu of Corpus Callosum Right | WM |
| 141 | BCC_R | Body of Corpus Callosum Right | WM |
| 142 | SCC_R | Splenium of Corpus Callosum Right | WM |
| 143 | RLIC_R | Retrolenticular Part of Internal Capsule Right | WM |
| 144 | REDNC_R | Red Nucleus Right | GM |
| 145 | SNIGRA_R | Substantia Nigra Right | GM |
| 146 | TAP_R | Tapatum Right | GM |
| 147 | Caud_R | Caudate Nucleus Right | GM |
| 148 | Put_R | Putamen Right | GM |
| 149 | Thal_R | Thalamus Right | GM |
| 150 | GP_R | Globus Pallidus Right | GM |
| 151 | Midbrain_R | Midbrain Right | GM |
| 152 | Pons_R | Pons Right | WM |
| 153 | Medulla_R | Medulla Right | WM/GM |

| | | | |
|-----|----------------|---------------------------------|----|
| 154 | SPwm_R | Superior Parietal WM Right | WM |
| 155 | Cingwm_R | Cingulum WM Right | WM |
| 156 | SFWM_R | Superior Frontal WM Right | WM |
| 157 | MFWM_R | Middle Frontal WM Right | WM |
| 158 | IFWM_R | Inferior Frontal WM Right | WM |
| 159 | PrCWM_R | Precentral WM Right | WM |
| 160 | PoCWM_R | Postcentral WM Right | WM |
| 161 | AWM_R | Angular WM Right | WM |
| 162 | PrCuWM_R | Pre-Cuneus WM Right | WM |
| 163 | CuWM_R | Cuneus WM Right | WM |
| 164 | LWM_R | Lingual WM Right | WM |
| 165 | Fuwm_R | Fusiform WM Right | WM |
| 166 | SOWM_R | Superior Occipital WM Right | WM |
| 167 | IOWM_R | Inferior Occipital WM Right | WM |
| 168 | MOWM_R | Middle Occipital WM Right | WM |
| 169 | STWM_R | Superior Temporal WM Right | WM |
| 170 | ITWM_R | Inferior Temporal WM Right | WM |
| 171 | MTWM_R | Middle Temporal WM Right | WM |
| 172 | LFOWM_R | Lateral Fronto-Orbital WM Right | WM |
| 173 | MFOWM_R | Middle Fronto-Orbital WM Right | WM |
| 174 | SMWM_R | Supramarginal WM Right | WM |
| 175 | RGWM_R | Rectus WM Right | WM |
| 176 | Cerebellumwm_R | Cerebellum WM Right | WM |

¹Right and Left measures of FA and TR were averaged out before analyses C and D was carried out. This resulted in 98 measures in total, 49 for FA and 49 for TR, when excluding measures with missing data. Measures included in the analysis are bolded and in red font. All others are excluded. In addition, cerebellum wm TR (Right and Left) were only available for 85 subjects, as was the case for SNIGRA FA/TR (Right and Left). TR is also known as mean diffusivity or MD.

Supplemental Table 3. Top 10 adjusted associations from models A (total, GM, WM) and B (regional GM, WM) vs. longitudinal annual rate of change exposures; : serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected P<0.05: ordinary least square brain scan-wide analyses on HANDLS 2004-2013 and HANDLS-SCAN 2011-2015^a

| | Outcome (V _{scan}) | Outcome description | Longitudinal Exposure (v ₂ -v ₁) annualized | Stratum | (N) | B | (SE) | P _{uncorr} | Standardized Beta (b) | q-value | Passes FWER correction | Standardize d Beta (b): SA ^b | P _{uncorr} : SA |
|-------------------|---------------------------------|-----------------------------------|---|----------------|--------------|---------------------------|----------------|---------------------|--------------------------|-------------------|------------------------------|---|-----------------------------|
| MODEL A | | | | | | | | | | | | | |
| Overall | WM | White matter | 25(OH)D | — | (186) | 2031 | (760) | 8.2e-03 | +0.16 | 0.074 | Yes | +0.14 | 0.021 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | — | (186) | +1501.4 | (665.1) | 0.017 | +0.14 | 0.076 | Yes | +0.13 | 0.032 |
| Stratified | WM | White matter | 25(OH)D | Males | (87) | +4,995^c | (1,340) | 3.6e-04 | +0.37 | 0.020 | Yes | +0.37 | 0.001 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | Males | (87) | +1491.9 ^c | (477.1) | 6.2e-04 | +0.31 | 0.021 | No | +0.36 | 0.001 |
| | WM | White matter | 25(OH)D | >50y | (80) | +3576^c | (1029) | 8.6e-04 | +0.31 | 0.021 | Yes | +0.22 | 0.013 |
| | TOTALBRAIN | Total brain | 25(OH)D | >50y | (80) | +6131 ^c | (1950) | 2.4e-03 | +0.27 | 0.038 | No | +0.19 | 0.020 |
| | GM | Gray Matter | 25(OH)D | Males | (87) | +4320 ^c | (1392) | 2.6e-03 | +0.27 | 0.038 | No | +0.32 | 0.003 |
| | GM | Gray Matter | 25(OH)D | >50y | (80) | +2555 | (1033) | 1.6e-02 | +0.22 | 0.18 ^d | No | +0.16 | 0.052 |
| | WM | White matter | 25(OH)D | AP | (132) | +2,112 | (874) | 1.7e-02 | +0.17 | 0.18 | No | +0.14 | 0.064 |
| | GM | Gray Matter | B-12 | AP | (161) | +37 | (17) | 3.1e-02 | +0.13 | 0.25 | No | +0.08 | 0.24 |
| | TOTALBRAIN | Total brain volume | 25(OH)D | AP | (132) | 3703 | (1699) | 3.1e-02 | +0.15 | 0.25 | No | +0.12 | 0.077 |
| | TOTALBRAIN | Total brain volume | B-12 | AP | (161) | +67 | (32) | 3.8e-02 | +0.13 | 0.25 | No | +0.07 | 0.29 |
| MODEL B | | | | | | | | | | | | | |
| Overall | OCCIPITAL_WM | Occipital white matter | 25(OH)D | — | (186) | 308 | (90) | 7.4e-04 | +0.20 | 0.018 | Yes | +0.20 | <0.001 |

| | | | | | | | | | | | | | |
|------------|--------------|------------------------|---------|--------|-------|-------------------|-------|---------|-------|-------|-----|-------|-------|
| | PARIETAL_WM | Parietal white matter | 25(OH)D | — | (186) | 477 | (177) | 7.7e-03 | +0.17 | 0.086 | No | +0.16 | 0.019 |
| | FRONTAL_GM | Frontal Gray matter | B-12 | — | (240) | 15.0 | (5.9) | 1.1e-02 | +0.13 | 0.086 | No | +0.08 | 0.22 |
| | OCCIPITAL_GM | Occipital Gray matter | B-12 | — | (240) | 6.0 | (2.5) | 1.9e-02 | +0.12 | 0.086 | No | +0.10 | 0.12 |
| | FRONTAL_WM | Frontal White matter | 25(OH)D | — | (186) | 783 | (335) | 2.0e-02 | +0.14 | 0.086 | No | +0.13 | 0.048 |
| | FRONTAL_WM | Fontal White matter | B-12 | — | (240) | 14.7 | (6.5) | 2.5e-02 | +0.13 | 0.086 | No | +0.08 | 0.21 |
| | OCCIPITAL_GM | Occipital Gray matter | 25(OH)D | — | (186) | 298.5 | (132) | 2.5e-02 | +0.13 | 0.09 | No | +0.12 | 0.042 |
| | PARIETAL_GM | Parietal Gray matter | 25(OH)D | — | (186) | 368.0 | (170) | 3.2e-02 | +0.13 | 0.10 | No | +0.13 | 0.049 |
| | TEMPORAL_WM | Temporal White matter | 25(OH)D | — | (186) | 365.8 | (174) | 3.7e-02 | +0.12 | 0.20 | No | +0.11 | 0.074 |
| Stratified | OCCIPITAL_WM | Occipital white matter | 25(OH)D | >50 | (80) | 515 ^c | (117) | 3.5e-05 | +0.38 | 0.007 | Yes | +0.28 | 0.002 |
| | OCCIPITAL_WM | Occipital white matter | 25(OH)D | Males | (87) | 595 ^c | (152) | 1.9e-04 | +0.37 | 0.018 | Yes | +0.37 | 0.001 |
| | FRONTAL_WM | Frontal White matter | 25(OH)D | Males | (87) | 2151 ^c | 582 | 3.9e-04 | +0.37 | 0.025 | Yes | +0.38 | 0.001 |
| | PARIETAL_WM | Parietal White matter | 25(OH)D | Males | (87) | 1048 | 294 | 6.1e-04 | +0.35 | 0.029 | Yes | +0.34 | 0.003 |
| | PARIETAL_WM | Parietal White matter | 25(OH)D | >50 | (80) | 830 ^c | (242) | 9.9e-04 | +0.32 | 0.033 | No | +0.25 | 0.009 |
| | OCCIPITAL_WM | Occipital White matter | 25(OH)D | AP | (132) | 344 | (102) | 1.0e-03 | +0.23 | 0.033 | No | +0.22 | 0.003 |
| | OCCIPITAL_WM | Occipital White matter | 25(OH)D | Whites | (109) | 364 | (114) | 1.9e-03 | +0.25 | 0.051 | No | +0.24 | 0.002 |
| | OCCIPITAL_GM | Occipital Gray matter | 25(OH)D | >50 | (80) | 517 ^c | (169) | 3.0e-03 | +0.26 | 0.061 | No | +0.18 | 0.028 |

| | | | | | | | | | | | | |
|-----------------|--------------------------|---------|-------|------|-------------------|-------|---------|-------|-------|----|-------|-------|
| TEMPORAL _WM | Temporal White matter | 25(OH)D | >50 | (80) | 729 ^c | (238) | 3.1e-03 | +0.26 | 0.061 | No | +0.18 | 0.034 |
| FRONTAL_GM | Frontal Gray matter | 25(OH)D | Males | (87) | 1591 ^c | (523) | 3.1e-03 | +0.27 | 0.061 | No | +0.31 | 0.004 |

Abbreviations: 25(OH)D=25-hydroxyvitamin D; AP=Above poverty; B-12=serum cobalamin (vitamin B-12); FDR=False Discovery Rate; FOL=serum folate; FWER=FamilyWise Error Rate; GM=Gray Matter; SA=Sensitivity Analysis; SE=Standard Error; WM=White Matter.

^a Values are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, FWER<0.05.

^b Based on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (See Supplemental methods 2).

^c P<0.10 for null hypothesis that exposure×stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^d Finding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥ 0.20 .

Supplemental Table 4. Top 10 adjusted associations from model C, small sMRI regions vs. longitudinal annual rate of change exposures: serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected P<0.05: ordinary least square brain scan-wide analyses on HANDLS 2004-2013 and HANDLS-SCAN 2011-2015^a

| Outcome (V _{scan}) | Outcome description | Longitudinal Exposure (v ₂ -v ₁) annualized | Stratum | (N) | β | (SE) | P | Standardized Beta (b) | q-value | Passes FW Bonferroni correction | Standardized Beta (b): SA ^b | P _{uncorr.} : SA |
|-------------------------------------|--|---|---------|-------|--------|--------|---------|------------------------------|--------------------|---------------------------------|--|---------------------------|
| Overall | | | | | | | | | | | | |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | — | (186) | +38.5 | (8.6) | 1.3e-05 | +0.27 | 0.005 | Yes | +0.26 | <0.001 |
| occipital_lobe_WM_left | Occipital lobe, white matter, left | 25(OH)D | — | (186) | +170.9 | (46.9) | 3.5e-04 | +0.22 | 0.074 ^d | No | +0.22 | 0.001 |
| Right_TrIFG_triangular_part_of_t | Triangular part of the inferior frontal gyrus, right | B-12 | — | (240) | +0.59 | (0.18) | 1.6e-03 | +0.20 | 0.19 ^d | No | +0.19 | 0.014 |
| Right_PrG_precentral_gyrus | Precentral gyrus, right | B-12 | — | (240) | +1.37 | (0.45) | 2.9e-03 | +0.17 | 0.19 | No | +0.11 | 0.099 |
| Right_Calc_calcarine_cortex | Calcarine cortex, right | B-12 | — | (240) | +0.67 | (0.23) | 3.5e-03 | +0.18 | 0.19 | No | +0.15 | 0.047 |
| anterior_limb_of_internal_cap0 | Anterior limb of the internal capsule, right | 25(OH)D | — | (186) | +17.2 | (5.8) | 3.6e-03 | +0.19 | 0.19 | No | +0.17 | 0.014 |
| Left_OrIFG_orbital_part_of_the_i | Orbital part of the inferior frontal gyrus, left | B-12 | — | (240) | +0.34 | (0.12) | 3.6e-03 | +0.17 | 0.19 | No | +0.24 | 0.001 |
| parietal_lobe_WM_right | Parietal lobe, white matter, right | 25(OH)D | — | (186) | +250 | (87) | 4.4e-03 | +0.18 | 0.19 | No | +0.17 | 0.010 |
| Left_Thalamus_Proper | Thalamus proper, left | 25(OH)D | — | (186) | +44 | (15) | 4.5e-03 | +0.17 | 0.19 | No | +0.16 | 0.014 |
| occipital_lobe_WM_right | Occipital lobe, white matter, right | 25(OH)D | — | (186) | +137 | (47) | 4.6e-03 | +0.17 | 0.19 | No | +0.17 | 0.009 |
| Stratified | | | | | | | | | | | | |

| | | | | | | | | | | | | |
|--------------------------------|--|----------------|--------------|--------------|--------------------------|---------------|----------------|--------------|--------------------|------------|--------------|------------------|
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | Males | (87) | +62.0^c | (12.6) | 4.6e-06 | +0.43 | 0.015 | Yes | +0.43 | <0.001 |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | AP | (132) | +40.4 | (9.2) | 2.6e-05 | +0.31 | 0.037 | Yes | +0.25 | 0.001 |
| occipital_lobe_WM_left | Occipital lobe, white matter, left | 25(OH)D | >50 | (80) | +263 ^c | (60) | 4.5e-05 | +0.38 | 0.037 ^d | No | +0.26 | 0.002 |
| Right_TMP_temporal_pole | Right temporal pole | FOL | Whites | (97) | -92 | (36) | 4.8e-05 | -0.25 | 0.037 ^d | No | -0.25 | 0.074 |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | Whites | (109) | +43 | (10) | 5.4e-05 | +0.35 | 0.037 ^d | No | +0.29 | <0.001 |
| anterior_limb_of_internal_cap | Anterior limb of the internal capsule, left | 25(OH)D | >50 | (80) | +37.2 ^c | (9.1) | 1.1e-04 | +0.39 | 0.061 ^d | No | +0.31 | 0.001 |
| anterior_limb_of_internal_cap0 | Anterior limb of the internal capsule, right | 25(OH)D | >50 | (80) | +29.3 ^c | (7.4) | 1.6e-04 | +0.38 | 0.073 ^d | No | +0.29 | 0.002 |
| occipital_lobe_WM_right | Occipital lobe, white matter, right | 25(OH)D | >50 | (80) | +252 ^c | (63) | 1.7e-04 | +0.35 | 0.073 ^d | No | +0.24 | 0.006 |
| Left_Pallidum | Left Pallidum | 25(OH)D | >50 | (80) | +11.8 | (3.1) | 2.5e-04 | +0.36 | 0.088 ^d | No | +0.14 | 0.004 |
| Left_OCP_occipital_pole | Left occipital pole | 25(OH)D | ≤50 | (106) | +47.5 | (12.6) | 2.8e-04 | +0.29 | 0.088 ^d | No | +0.33 | 0.001 |

Abbreviations: 25(OH)D=25-hydroxyvitamin D; AP=Above poverty; B-12=serum cobalamin (vitamin B-12); FDR=False Discovery Rate; FOL=serum folate; FWER=FamilyWise Error Rate; GM=Gray Matter; SA=Sensitivity Analysis; SE=Standard Error; WM=White Matter.

^a Values are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, FWER<0.05.

^b Based on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (See Supplemental methods 2).

^c P<0.10 for null hypothesis that exposure×stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^d Finding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥0.20.

Supplemental Table 5. Top 10 adjusted associations from model D, bilateral means of MD and FA from dMRI vs. longitudinal annual rate of change exposures : serum 25(OH)D, folate and cobalamin (overall and stratified analysis) with uncorrected $P < 0.05$: ordinary least square brain scan-wide analyses on HANDLS 2004-2013 and HANDLS-SCAN 2011-2015^a

| Outcome (V _{scan}) | Outcome description | Longitudinal Exposure (V ₂ -V ₁) annualized | Stratum | (N) | β | (SE) | P | Standardized Beta (b) | q-value | Passes FW Bonferroni correction | Standardized Beta (b): SA ^b | P _{uncorr} : SA |
|---------------------------------|--|---|---------|-------|---------|--------|---------|--------------------------|--------------------|---------------------------------------|---|-----------------------------|
| Overall | | | | | | | | | | | | |
| alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0020 | 0.0004 | 2.2e-06 | +0.33 | 0.001 | Yes | +0.29 | <0.001 |
| cgh_b_fa | Cingulum (Hippocampus), fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0016 | 0.0004 | 1.9e-04 | +0.26 | 0.028 | Yes | +0.23 | 0.002 |
| ss_b_fa | Sagittal Stratum | 25(OH)D | — | (185) | +0.0012 | 0.0003 | 4.6e-04 | +0.25 | 0.037 ^d | No | +0.21 | 0.001 |
| cgc_b_fa | Cingulum (Cingulum), fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0015 | 0.0004 | 5.1e-04 | +0.26 | 0.037 ^d | Yes | +0.22 | 0.003 |
| ec_b_tr | External capsule, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0012 | 0.0004 | 7.2e-04 | +0.24 | 0.042 ^d | No | +0.23 | 0.002 |

| | | | | | | | | | | | | |
|-------------------|---|---------|--------|-------|------------------------|------------|---------|-------|--------------------|-----|-------|--------|
| alic_b_tr | Anterior limb of the internal capsule, mean diffusivity, bilateral mean | FOL | — | (240) | -9.75e-06 | 2.91e-06 | 9.6e-04 | -0.20 | 0.047 ^d | No | -0.23 | 0.004 |
| sfo_b_fa | Superior Frontal Occipital Fasciculus, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.002 | 0.0006 | 1.2e-03 | 0.24 | 0.048 ^d | No | +0.24 | 0.003 |
| mcp_b_tr | Middle Cerebellar Peduncle, mean diffusivity, bilateral mean | B-12 | — | (240) | -1.94e-07 | 6.08e-08 | 1.6e-03 | -0.20 | 0.058 | No | -0.19 | 0.011 |
| plic_b_fa | Posterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0013 | 0.0004 | 2.0e-03 | +0.22 | 0.065 | No | +0.21 | 0.003 |
| pons_b_fa | Pons, fractional anisotropy, bilateral mean | 25(OH)D | — | (185) | +0.0011 | 0.0004 | 2.4e-03 | +0.20 | 0.069 | No | +0.23 | 0.001 |
| Stratified | | | | | | | | | | | | |
| alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | Whites | (109) | +0.0024 | (0.0005) | 1.6e-06 | +0.43 | 0.004 | Yes | +0.34 | <0.001 |
| alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | ≤50 | (106) | +0.0026 | (0.0006) | 3.4e-05 | +0.39 | 0.041 ^d | No | +0.44 | <0.001 |
| unc_b_tr | Uncinate Fasciculus, mean | FOL | AA | (98) | -0.000019 ^c | (4.56e-06) | 5.7e-05 | -0.40 | 0.045 ^d | No | -0.41 | 0.001 |

| | | diffusivity, bilateral mean | | | | | | | | | | | |
|--|-----------|---|---------|--------|-------|-----------------------|------------|---------|-------|--------------------|----|-------|--------|
| | sfo_b_fa | Superior Fronto-Occipital Fasciculus, fractional anisotropy, bilateral mean | 25(OH)D | Males | (85) | +0.00392 ^c | (0.0009) | 8.4e-05 | +0.41 | 0.049 ^d | No | +0.49 | <0.001 |
| | cgc_b_fa | Cingulum (Cingulate Gyrus), fractional anisotropy, bilateral mean | 25(OH)D | Whites | (109) | +0.0019 | (0.0005) | 1.7e-04 | +0.35 | 0.063 ^d | No | +0.30 | <0.001 |
| | rlic_b_fa | Retrolenticular Part of Internal Capsule, fractional anisotropy, bilateral mean | 25(OH)D | ≤50 | (106) | +0.0024 ^c | (0.0006) | 2.0e-04 | +0.35 | 0.063 ^d | No | +0.30 | 0.004 |
| | alic_b_fa | Anterior limb of the internal capsule, fractional anisotropy, bilateral mean | 25(OH)D | BP | (52) | +0.0035 ^c | (0.0009) | 2.4e-04 | +0.50 | 0.063 ^d | No | +0.63 | <0.001 |
| | ec_b_fa | External capsule, fractional anisotropy, bilateral mean | 25(OH)D | BP | (52) | +0.0040 ^c | (0.0009) | 2.4e-04 | +0.50 | 0.063 ^d | No | +0.67 | 0.001 |
| | alic_b_tr | Anterior limb of the internal capsule, Mean diffusivity, bilateral mean | FOL | Males | (103) | -0.000013 | (3.62e-06) | 3.3e-04 | -0.33 | 0.063 ^d | No | -0.20 | 0.043 |
| | cgh_b_fa | Cingulum (Hippocampus), fractional anisotropy, bilateral mean | 25(OH)D | BP | (52) | +0.0044 ^c | (0.00114) | 3.5e-04 | +0.49 | 0.063 ^d | No | +0.76 | 0.001 |

Abbreviations: 25(OH)D=25-hydroxyvitamin D; AP=Above poverty; B-12=serum cobalamin (vitamin B-12); FDR=False Discovery Rate; FOL=serum folate; FWER=FamilyWise Error Rate; GM=Gray Matter; SA=Sensitivity Analysis; SE=Standard Error; WM=White Matter.

^a Values are adjusted linear regression coefficients β with associated SE, standardized beta, uncorrected p-values, corrected q-values (false discovery rate) and results of sensitivity analysis. (N) is the sample size in each analysis. Bolded rows correspond to statistically significant associations after correction for multiple testing, FWER<0.05.

^b Based on a sensitivity analysis further adjusting for selected socio-demographic, lifestyle and health-related factors after screening using machine learning techniques (See Supplemental methods 2).

^c P<0.10 for null hypothesis that exposure×stratifying variable 2-way interaction term is =0 in the unstratified model with exposure and socio-demographic factors included as main effects.

^d Finding considered a trend for passing FDR q-value correction at type I error of 0.10 per vitamin, model and stratification status while failing the FWER criterion, due to a standardized effect size (in absolute value) ≥ 0.20 .

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